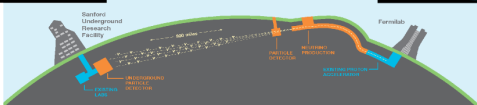
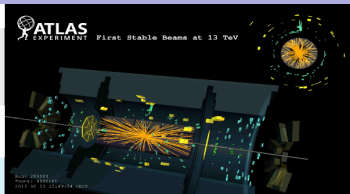
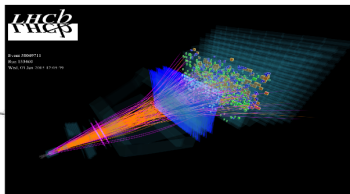
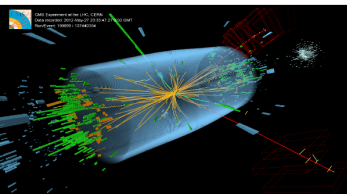


SFT **PH-SFT**
SoFTware Development for Experiments



The Inter-experimental Machine Learning Group

Michele Floris, Sergei Gleyzer, Steven Schramm, Tim Head
On behalf of the IML group



Outline

- What is IML?
- Activities
- Format
- Topics
- Future outlook

What is IML

- Inter-experimental Machine Learning Working Group
 - Founded mid-2015
 - Started with a community effort to upgrade and modernize ML methods and tools in HEP
 - Rapidly grew into a mature group endorsed by all LHC experiments in 2016
 - IML website: iml.cern.ch
 - News, Activities, Tasks, Software, Meetings, Forum

































IML Format

- Monthly meetings around an ML topic of interest in HEP
 - Work on-going in between meetings
 - Easy to see what others are working on, share ideas, discuss methods and tools useful for all HEP experiments
 - Extremely beneficial to participants
 - Strong and continuously growing community
 - Continuous year-round effort

Topics

- Modernization of HEP ML Tools (1,2)
- HEP-ML Challenges (1)
- ML Software and Tools in HEP (1,2)
- Deep Learning (1)
- Function Estimation with Regression
- Anomaly Detection
- Unsupervised Learning
- Multiclass Classification

Meeting Example

15:00 → 15:10	News and updates 			10m 
Speakers: Michele Floris (CERN), Steven Randolph Schramm (Université de Genève (CH)), Tim Head (Ecole Polytechnique Fédérale de Lausanne (CH)), Sergei Gleyzer (University of Florida (US)) 				
  20160414_IML_ne...				
15:10 → 15:30	Bayesian neural networks and general remarks about IML			20m 
Speaker: Harry Prosper (Florida State University (US)) 				
  IML_Prosp_14Ap...				
15:35 → 15:55	Deep learning and NN overview, keras tutorial			20m 
Speaker: Michela Paganini (Yale University (US)) 				
  NNinKeras_MPag...				
16:00 → 16:20	Gradient reversal layers in deep neural networks for transfer learning			20m 
Speaker: Paul Seyfert (Università & INFN, Milano-Bicocca (IT)) 				
  pseyfert.pdf				
16:25 → 16:45	Jet images in delphes			20m 
Speaker: Daniel Hay Guest (University of California Irvine (US)) 				
  dguest_di.pdf				
16:50 → 17:10	Deep Learning at NOvA			20m 
Speakers: Adam Jude Aurisano, Adam Aurisano (unknown), Adam Aurisano (University of Cincinnati)				
  aurisano_CNNid_L...				
17:15 → 17:35	Deep Learning Event Reconstruction, From LArTPC to ATLAS Calorimeter			20m 
Speaker: Amir Farbin (University of Texas at Arlington (US))  				
  IML-DL.pdf				

Non-LHC

Software Example

- A **community** effort identified places where our tools needed **improvements**
 - Significant work undertaken by **IML** and the software group to address that challenge (a lot already complete, some in progress)
 - **Continuous** efforts in evaluation of **new ideas in ML**: methods, tools, and practices
 - Providing a common ground for testing/evaluation
 - No need for duplication of efforts
 - **Significant** effort in providing **interfaces** to interesting and valuable **ML tools**
 - Bringing them into our ecosystem
 - Building on the work of others

MEM+ML Example

- Last year a potentially **interesting** new research area identified connecting **Matrix Element Methods (MEM)** with **ML**
 - High **domain knowledge** area in **HEP+ML**
 - Presented as challenge idea in December **IML** meeting
 - Discussed in **EPlanet** Mini-Course in Brazil (SG/LM Nov-Dec. 2015)
 - Participating **HEP** faculty with significant **MEM** experience begin active **IML** involvement with a strong effort in this direction
 - also contributing to relevant **ML software** work and tasks (**deep learning**)
 - receiving expert ML help in this area
 - Many similar stories, examples
 - sharing of ideas, tools, solutions leads to progress
 - **IML is for the community and by the community**
 - A high number of **IML** volunteers on variety of tasks especially software/tools/interfaces/applied **HEP ML**

Future outlook of the IML

- One important **IML** aspect is to facilitate inter-experimental communication on **ML**
- The **IML** has now been formally recognized by all LHC experiments
- By also becoming an **LPCC group**, there are **many benefits**
 - Access to funds and logistical support
 - Meetings, coffee breaks, workshops, CERN access for non-members, ...
- The **IML** will continue to involve all interested **HEP** experiments
 - We've already had presentations from **DUNE**, **NO ν A**, and **ML** experts
 - Other experiments have also expressed interest

Support for HEP-ML software

- Another IML aspect: identify critical ML software packages for HEP
- Working closely and in coordination with CERN software group and experiments
 - Can ensure that ML packages meet good software/code standards and are supported long-term
 - When needed, support is possible to bring promising new developments to fruition

Tutorials on ML software

- Another way to increase software support: **have more interested users**
 - Some of those users can become **developers**
- It's always good to attract more **developers** to the field
- The **IML** will continue to provide tutorials on **HEP-ML** packages
 - Some active **IML** members have already given **tutorials** in the past
 - We hope to do this more often and create an open database of **tutorials** and **ML educational materials**

Outreach and Education

- ML Schools, Workshops, Courses, Tutorials
 - 2 ML software tutorials at DS@LHC 2015
 - Eplanet Course + 5 Tutorials in Statistics and ML (Brazil) Nov-Dec. 2015
 - ALICE Workshop in Statistics and ML (lecture and tutorial, May 2016)
 - ESI ML Lectures/Tutorials June 2016
 - Related schools and Conference Sessions:
 - MLHEP Summer School July 2016
 - QCHS Statistics and ML Session Aug 2016

Increasing collaboration with ML experts

- It is important to increase discussion between ML and HEP
- Example of a common scenario:
 - HEP expert has a problem, but doesn't know which ML tool to use
 - ML expert has lots of tools, but doesn't understand the HEP problem
- The IML addresses this by bringing HEP+ML experts together

Data Science @ LHC workshop

- The recent **DS@LHC** workshop was a great success
 - Great contributions from many experiments
 - Lots of input directly from the **ML** community
- The **IML** meetings and **DS@LHC** workshop are mutually beneficial
 - **DS@LHC**: a *workshop* brings together experts, lots of great discussions
 - **IML**: a *working group* with regular meetings, updates, and similar

Upcoming meetings

- Next IML meeting: *function estimation with regression*
 - May 17 at 15:00 in the CERN main auditorium (or remotely on vidyo)
- Ideas for future meetings (alphabetically):
 - Anomaly detection
 - Benchmark datasets
 - Multi-class classification
 - Unsupervised methods
 - Suggestions of other topics are welcome!

IML and HSF

Software Experiments Sciences Organizations Institutes Resources Links Events People

Software

Categories and software

All software

Analysis

Arco

CLHEP

DataMelt

FairRoot

FREEHep Java libraries

Galaxy

HepSim

LArSoft

NPFinder

ProMC

R

ROOT

StatShape

TMVA - Toolkit for Multivariate Data Analysis with ROOT

IML - Inter-Experimental LHC Machine Learning WG

[Organizations](#)

The Inter-Experimental LHC Machine Learning Working Group (IML) is focused on the development of modern state-of-the-art machine learning methods, techniques and practices for high-energy physics problems. The group provides solutions, software and training beneficial for all LHC experiments as well as a forum where on-going work and relevant issues are discussed by the community.

Activities include

ROOT-R: an interface between ROOT and R that allows a large set of statistical tools provided by R to be used within the ROOT framework.

TMVA: The Toolkit for Multivariate Analysis (TMVA) is a ROOT-integrated machine-learning environment for the processing and parallel evaluation of multivariate classification and regression. TMVA is designed specifically to the needs of high-energy physics (HEP) applications. We are creating a new version of the toolkit with increased functionality and interfaces to other statistical packages such as R.

[Website](#)

[IML activities](#)

Associated with

- [Data science](#)
- [LHC, collider physics](#)
- [Machine learning](#)

IML and HSF

- During last ROOT workshop in Saas-Fee the idea that IML discussion forum can be used by HSF for ML discussions was proposed (P. Mato, S. Gleyzer, L. Moneta)
 - Great idea that should possibly get more advertisement
 - HSF Open-Source theme resonates with IML
 - IML strives for inclusivity, openness and collaboration among all participants and experiments in this area
 - IML more narrowly focused in Machine Learning in HEP
 - IML participants come from inside and outside HEP

- Some Examples:
 - Google Summer of Code students working on open-source software for HEP community to use (see Lorenzo's talk)
 - ML experts providing input/ideas/advice
 - HEP ML experts often create innovative solutions
 - IML can help raise awareness and bring ideas back to ML community at large

Conclusions

- Inter-Experimental Machine-Learning Working Group is mature and rapidly growing
 - Many ongoing activities
 - Monthly meeting format around topics of community interest, plus a lot of work ongoing
 - Significant modernization and upgrade effort of ML-HEP tools and evaluation of new tools + their interfaces
 - Officially endorsed by all LHC experiments
 - More participants are welcome! Anyone interested is welcome to join: visit iml.cern.ch or contact iml.coordinators@cern.ch