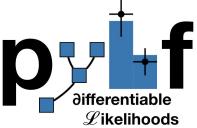
## pyhf Users and Developers Workshop

Introduction and Logistics

Matthew Feickert, Lukas Heinrich, Giordon Stark

December 4th, 2023



#### Welcome!

The pyhf developer team is happy to have you all participating in this workshop!

If you have any questions throughout the week please ask one of us and/or email **pyhf-workshop-organisers@cern.ch** 



Matthew Feickert







Lukas Heinrich

## Workshop Goals: Users Section (Monday - Wednesday)

- Bring the **user community together** to discuss use and find potential overlaps (kernels for common use/new features) and collaborations
- Learn what tooling is being built on top of pyhf to meet analysis needs
  - Can this be put into common libraries (e.g. <u>cabinetry</u>, <u>spey</u>)?
  - Projects to extend for analysis (e.g. <u>abcd\_pyhf</u>, <u>neos</u>, <u>bayesian\_pyhf</u>)
- Study **user experience**: identify common pain points, areas for improvements
- Start writing these down **collectively** in the **workshop Google Doc**

## Workshop Goals: Developers Section (Thursday - Friday)

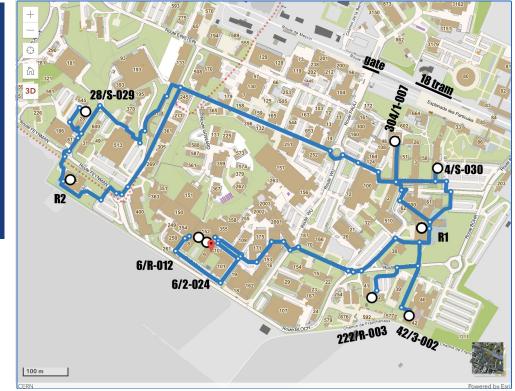
- Make everyone who wants to contribute to pyhf feel <u>empowered</u> to do so and equipped with knowledge of how
  - pyhf is an open source project for the whole community. It can be *your* project too.
- On-boarding session to induct new (and old) developers
- **Birds of a Feather** sessions: optimization, models, docs, etc.
- **Developer sprints**: got a task/feature/bug you wanna work on or fix? Documentation to improve?
- Sign up new volunteers to the developer team!
- Start writing these down collectively in the workshop Google
   <u>Doc</u>

#### **Meeting Rooms**

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Resources:

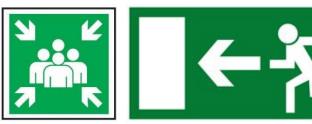
- CERN Map
- CERN Campus mobile app (<u>Google</u>, <u>iOS</u>)



## Safety and Evacuation



Follow these signs:



- If alarm sounds, leave the building using the nearest and safest exit route. All doors should be closed (but not locked) on leaving.
- If possible take your personal belongings (such as handbags and briefcases) with you when you leave.
   Do NOT return to collect belongings.
- 3. In the case of a fire, do not use the lifts.
- 4. Assist any person with a disability or reduced mobility to leave the building. Use evacuation chairs to carry people down the stairs.
- 5. Walk quickly and calmly to the designated assembly area (see below) for your building or as advised by an Emergency Guide or Fire and Rescue Service personnel.
- 6. Remain at the assembly area (in groups) until instructed to leave by the TSO or Fire and Rescue Service personnel.
- 7. Do not re-enter the building until informed that it is safe to do so by the TSO or Fire and Rescue Service personnel.







#### Food and Refreshments

- Snacks: in the workshop rooms for morning and afternoon sessions!
  - Will try to rotate them out daily(!)
- CERN Restaurants rotate menu daily
  - R1: <u>https://www.mynovae.ch/en/restaurant/13-restaurant-r1/</u>
  - R2: <u>https://www.mynovae.ch/en/restaurant/21-restaurant-r2-/</u>
- Snacking Areas: open from Monday to Friday in buildings 6, 13, 30, 40, 54
- Vending Machines: <u>maps.cern.ch map</u> (accepts card and cash)
- Click-and-Collect: <u>mynovae details</u> (order ahead, pick-up later)

## Social Dinner: Tuesday, 19h30

#### https://www.luigia.ch/en/academy/

Restaurant has wifi, password: happyluigia

Menu: https://menu.luigia.ch/menu/luigia

We will cover 50CHF/pp, order a la carte (drinks included), but you are responsible for anything over your allowance



**Contains Celery** If you see this symbol, the dish contains the indicated allergen.rv

n/a

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Vegetarian n/a This symbol indicates vegetarian product

Contiene Senape If you see this symbol, the dish contains the indicated allergen



Contains Gluten If you see this symbol the ontains the indicated alle



**Contains Eggs** If you see this symbol the contains the indicated alle



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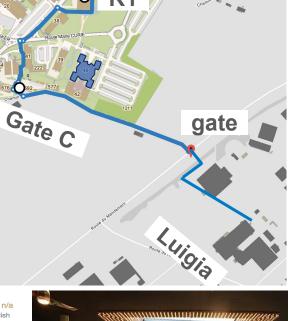
**Contains Dairy** If you see this symbol the dish contains the indicated allergen

#### Contains Traces Of n/a Nuts If you see this symbol, the dish

contains the indicated allergen



#### Contains Molluscs If you see this symbol the dish contains the indicated allergen





## SSL BinderHub / JupyterHub

- Thanks to the <u>IRIS-HEP Scalable</u> <u>Systems Laboratory</u> (SSL) for use of their BinderHub and JupyterHub instances
- These provide a JupyterHub based computing environment that allow for interactive computing and following talks and demos in real time
- https://binderhub.ssl-hep.org/
- https://jupyterhub.ssl-hep.org/
- Introduction to using BinderHub
   YouTube video





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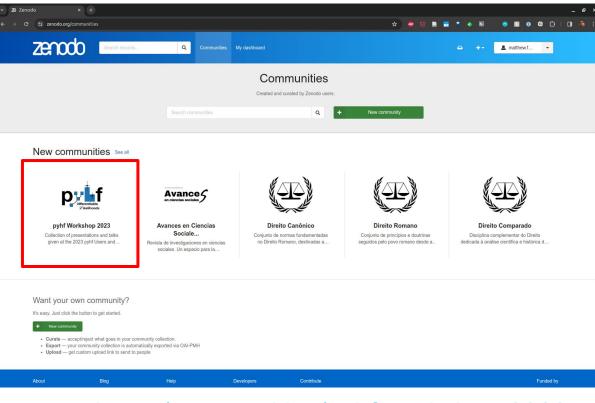
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#### Zendo Community archive of workshop



#### zenodo.org/communities/pyhf-workshop-2023

Thanks to supporting organizations



# OPEN CODE = BETTER SCIENCE

Support, funding, infrastructure, and services (NSF Cooperative Agreement <u>PHY-2323298</u>)

2023 Small Development Grant

#### **Use Citations**

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