First Hackathon of Machine Learning Advanced Level November 26–28, Padova

# Advanced Hackathon Infrastructure





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## Introduction

To practice with the machine learning exercises we want you to access to GPUs in the Cloud.

We have access to resources at:

- CNAF in Bologna
- ReCaS Bari

Thanks to the <u>Cloud approach</u>, the two sites are almost indistinguishable, though the flavor of the GPUs is slightly different.









Notebook Notebook **Docker** 











Docker



**Kubernetes Overlay** 



JupyterHub













**INFN Cloud Infrastructure and Platform** 

Bare Metal @ CNAF

**Bare Metal @ CNAF** 



NGINX: https://hpc-gpu-8-2-10.recas.ba.infn.it

Notebook













**Docker** 





Docker

**Filesystem Monitoring** 

**Kubernetes Overlay** 



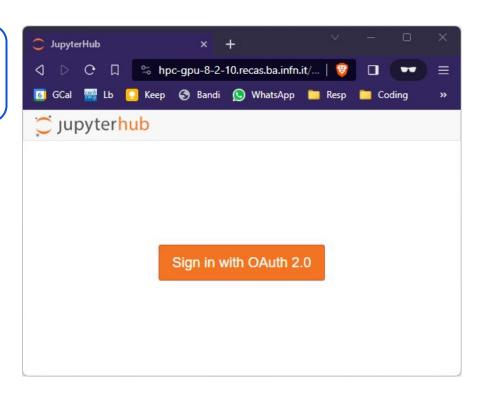


**Centos7 Operating System** 

**Bare Metal @ ReCaS Bari** 

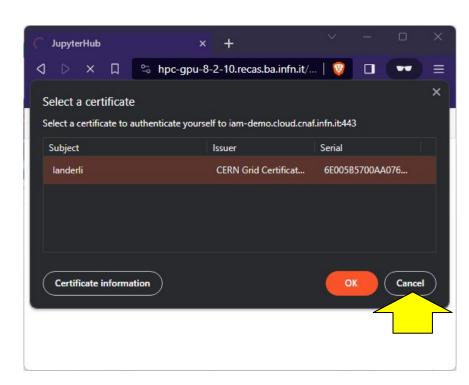
# **Behind the scenes:** *Landing page*

Hey, I am Jupyter Service running at ReCaS in Bari. I am not sure we met before... It's me! Jupyterhub

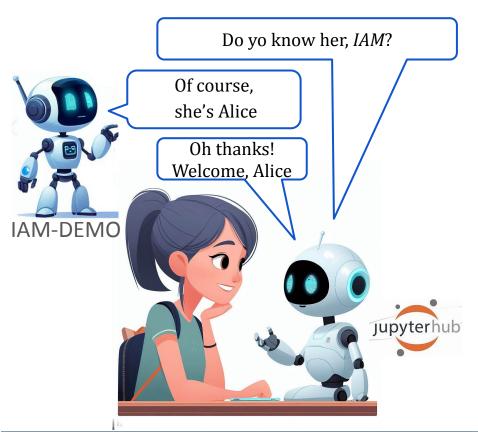


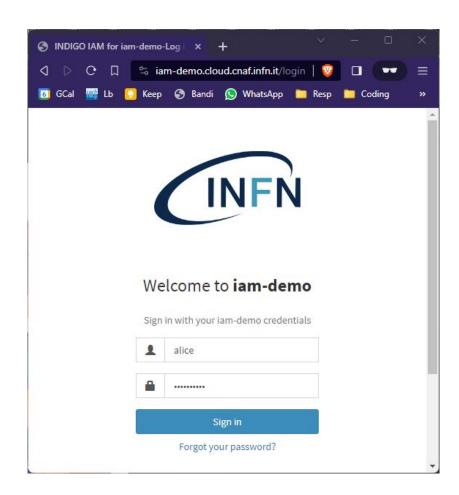
# **Authentication procedure**

Oh.. maybe you are a WLCG user? Not here for that Jupyterhub



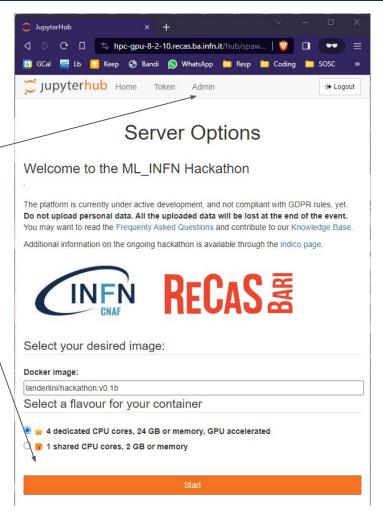
## **Authentication**



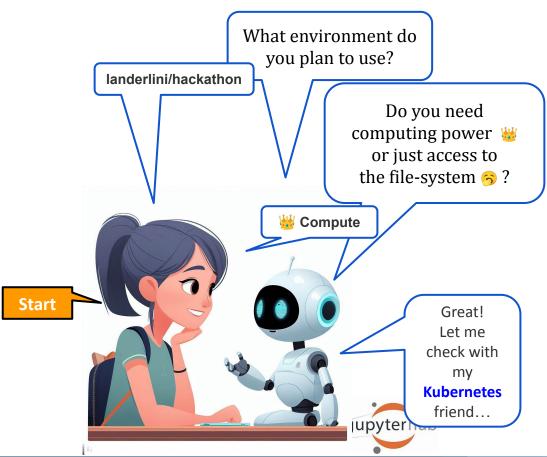


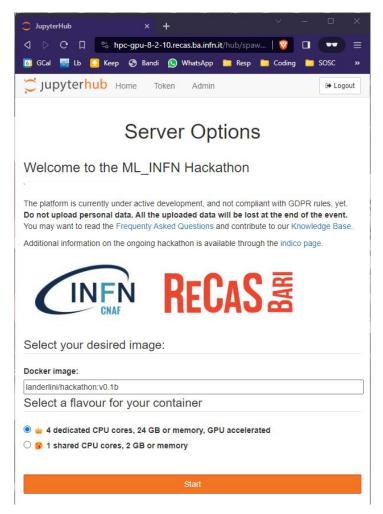
## **Authorization**

Remind me, is she allowed to log in? Yes! Great! Is she an admin? Yes! Welcome Alice. What do you want to be today? Jupyterhub



## **Authorization**



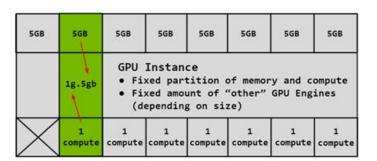


# **Spawning:** *Allocating resources*



Aye! I have nVidia GPUs, today, and there is an available GPU slot in one of the computing nodes.

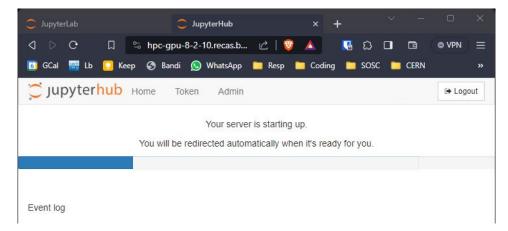
It's yours!



CPU and memory are available as well. I will start a **docker** for you.

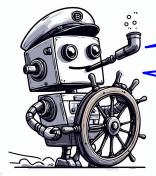






# **Spawning:** *Docker image*

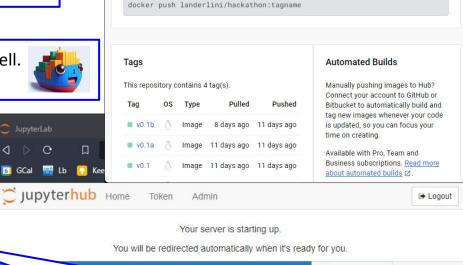
I found the image you requested, landerlini/hackathon, ON <a href="https://hub.docker.com">hub.docker.com</a> I will download it for you, if needed.



CPU and memory are available as well. I will start a **docker** for you.







landerlini/hackathon general | D × 🔵 JupyterLab (auto-Q)

landerlini / hackathon

This repository does not have a description 🧪

( Last pushed: 11 days ago

To push a new tag to this repository:

Docker commands

Description

□ Shub.docker.com/reposit... 🖒 🐯 🛕

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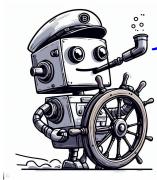
**Public View** 

# **Spawning:** PostStart hook and conda environment

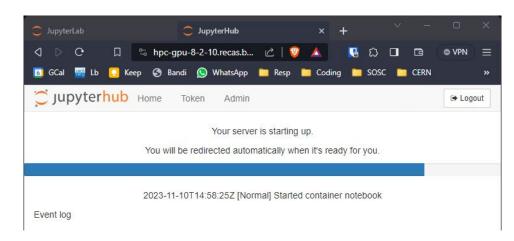
Aye!

Indeed conda in installed in this image.

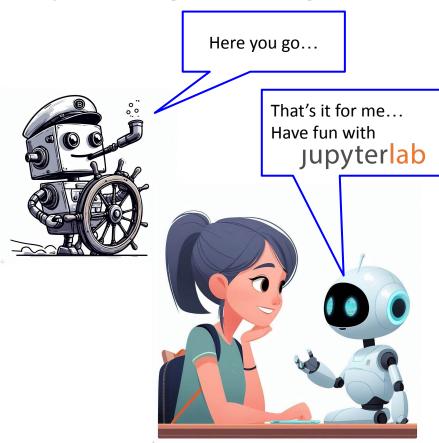
Just one last second...

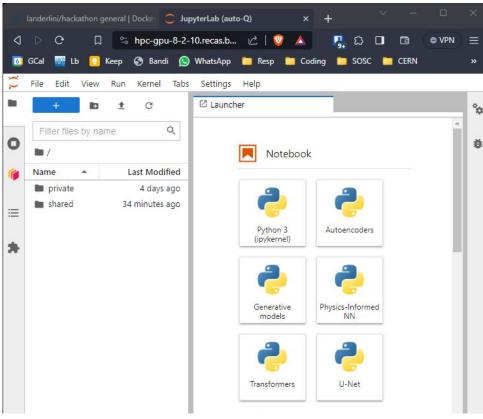






# **Spawning:** Starting the user interface



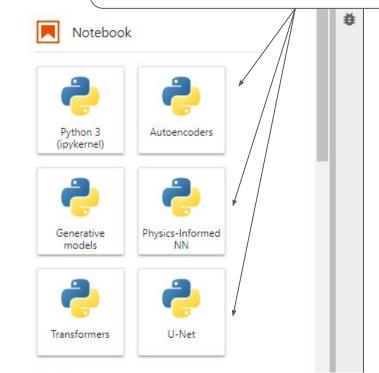


## **User interface**

View Run Kernel Tabs Filter files by name Dask dashboard Name Last Modified A door towards scalability private > 4 days ago (not for this hackathon) shared 34 minutes ago Cluster volumes mounted here Everyhere else is "Ephemeral Filesystem" Any data will be lost when the container is turned off

Available conda environments installed at cluster level and distributed via NFS to the various nodes.

Will use cvmfs one day, eventually.



Settings

☑ Launcher

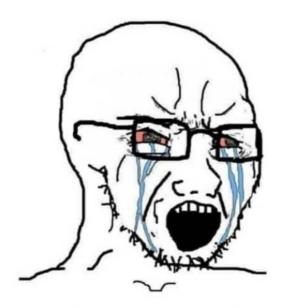
Help

Hackathon infrastructure File Edit View Run Kernel Tabs Settings Help File Edit View Run Kernel Tabs Settings Help 2 Console Terminal 1 å å Ctrl+Shift+L ■ Notebook New Launcher root@jupyter-anderlinil:/mlinfn# source private/.bashrc 5\_ Terminal (base) root@jupyter-anderlinil:/mlinfn# conda env list Open from Path... 益 # conda environments: source private/.bashrc Markdown File /envs/autoencoders New Console for Activity /envs/pinn Python File conda env list /envs/transformers /envs/unets Close Tab Alt+W /mlinfn/private/myenv \* /usr/local/miniconda3 nvidia-smi Ctrl+Shift+Q Shutdown Terminal base Close All Tabs (base) root@jupyter-anderlinil:/mlinfn# nvidia-smi -smi Fri Nov 10 15:54:39 2023 Save Save As... 29.05 CUDA Version: 11.5 NVIDIA-SMI 495,29.05 Driver Version: 495,29.05 CUDA Version: 11.5 Disp.A | Volatile Uncorr. ECO Disp.A | Volatile Uncorr. ECC Persistence-MI Bus-Id GPU-Util Compute M. Fan Temp Perf Pwr:Usage/Cap Memory-Usage GPU-Util Compute 4 nVidia A100 Reload from Disk Revert to Checkpoint NVIDIA A100-PCI... On 00000000:01:00.0 Off 00.0 Off **GPUs** PØ 57W / 250W N/A Default Rename... Enabled in the 00.0 Off On NVIDIA A100-PCI... On 000000000:25:00.0 Off 34W / 250W N/A Default bare metal Save and Export Notebook As... Enabled (no virtualization Save Current Workspace As... 2 NVIDIA A100-PCI... On 000000000:C1:00.0 Off 00.0 Off On Default PØ 32W / 250W N/A Defa Save Current Workspace Enab at ReCaS) Enabled Launch Dask Dashboard Lavout 00.0 Off 3 NVIDIA A100-PCI... On On 000000000:E1:00.0 Off N/A 23C PØ 33W / 250W N/A Defaul Default Hub Control Panel Log Out MIG devices: GPU GI CI MIG Memory-Usage Shared GPU GI CI MIG Memory-Usage Shared Unc | CE ENC DEC OFA ID ID Dev BAR1-Usage Unc | CE ENC DEC OFA JPG ID ID Dev BAR1-Usage Alice's MIG device 3MiB / 4864MiB | 14 3MiB / 4864MiB | 14 on GPU 2 OMiB / 8191MiB Simple O s\_ 0 @ Simple O Terminal 1 Terminal 1

#### **But I need MY VERY SPECIAL PACKAGES!**

No TensorBoard, no machine learning!!!!!!

I cannot work without VS Code!!!!!!!!!!!!!!



You are in the Cloud, man.

Just customize things.



# **Customization layers** (in the hands-on in a minute)

#### **Custom conda environments:**

If you just need custom software, but the user interface is fine  $\rightarrow$ 

For example, installing TensorBoard



#### **Custom Docker image:**

If you need a custom user interface or anything does not fit in conda  $\rightarrow$ 

For example, installing VS code

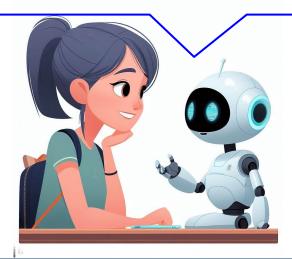


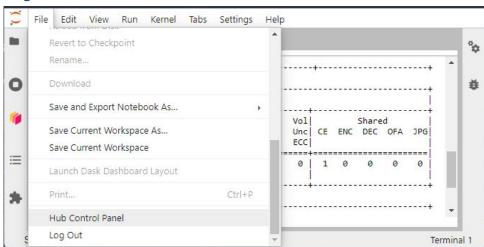
# **Culling:** Starting the user interface

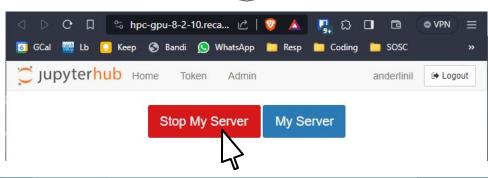
Ah, one last thing...

If I don't see you around for a while (few hours), I will destroy your container to free the resources for others. Be prepared.

But please, consider **freeing resources yourself** when you are done







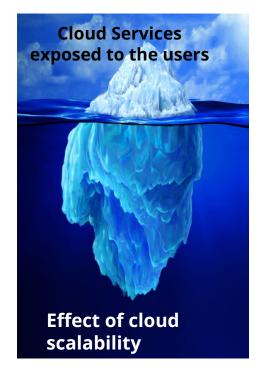
# And what about scaling?

Once you have your custom environment, running your custom software in your custom Docker container, it is time for you to scale up.

You will want to run the same code, in a non-interactive way, multiple times, possibly in parallel.

This comes with two complications:

- <u>economic</u>: a single GPU to enable development has a negligible cost wrt. your salary. The cost of hundreds of GPUs processing buggy workloads while you sleep is unacceptable.
- <u>competition and arbitration</u>: policies for a **fair share** of the resources must be formulated and implemented.



#### The future...







The Fifth Scientific Committee of INFN (CSN5) has recently funded a three-year project to evolve ML INFN facing these complications:

for INFN research

- Enhance our ability of using ALL (or at least most) resources in the Cloud if not employed otherwise (opportunistic usage), including FPGAs and Quantum Processors.
- Develop an infrastructure (monitoring, batch system and user-support) to enable implementing *extensive usage* and *fair share* of resources accessible to multiple scientific communities for hardware-accelerated machine-learning workloads.
- The European projects ICSC and Terabit are providing resources to develop and commission the whole thing.



## **Summary**

- JupyterHub on Kubernetes is the door for ML and Data Analysis tasks in the Cloud.
- Resources available in different servers in the same site can be transparently combined and accessed as a single cluster (e.g. CNAF).
- The same platform che be deployed in very different scenarios (e.g. CNAF on VMs and ReCaS on bare metal) providing very similar user experience.
- Users can customize their development environment with the tools they are used to (e.g. conda environments) or Cloud-native solutions (e.g. Docker containers).
- In the coming months it will become possible to **scale up** to multiple instances accessing resources otherwise unused possibly from remote computing centers.

#### **DISCLAIMER**

Please, consider yourselves as **beta testers of this novel setup** and be patient if something will need hot fixes during the hackathon.