















Where did we start?

In the past days you saw examples of the power of the new and distributed-friendly frameworks.

Especially for <u>interactive analysis</u>

What about cases that goes beyond interactivity?

Let's do a step back now.. Trying to generalize









Untangling the common requirements

If you step back enough you should start seeing some common needs for "any" kind of analysis: a payload to be executed on the optimal set of resource

Wearing the right glasses, we can also spot that all of them can be "easily containerizable"

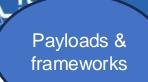
Good, now we have a set of containers to be executed for different use cases...





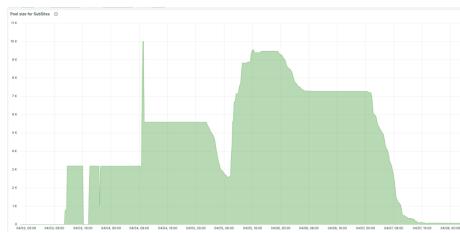






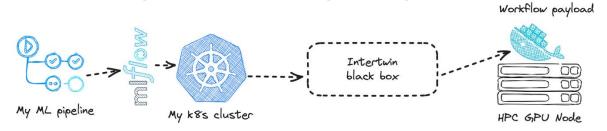
We do have a certain experience behind us on frameworks

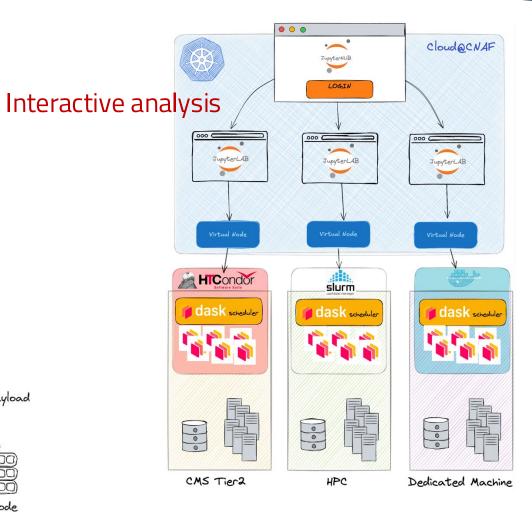
Grid/Batch processing



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ML/AI training and inference (growing up quickly)









Physical execution

Same for resource provisioning

We are used to not so unusual problem of making the matching with the payloads.

Can we possibly abstract this with a single interface?

Supercomputing at HPC

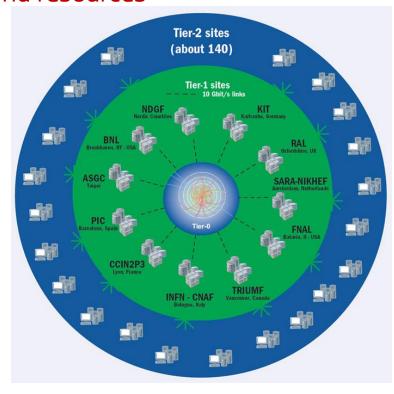
HPC bubbles



Cloud-like resources: on-demand GPUs or beefy VMs



Grid resources











In a nutshell

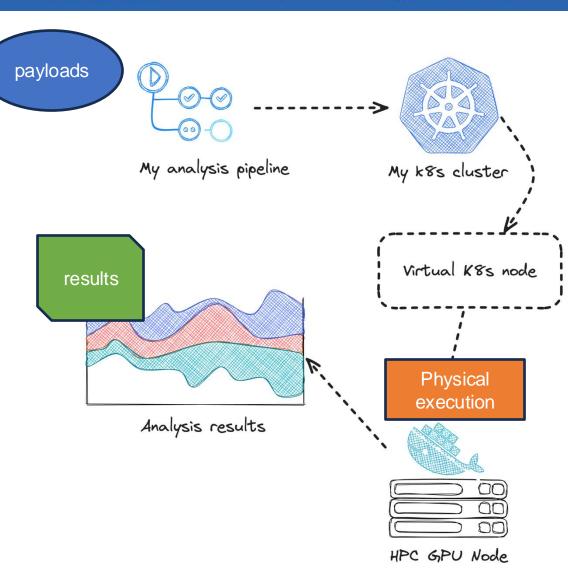
Now that there is a de-facto standard for orchestrating containers (and not only) → Kubernetes

Can we think of exploiting advanced use cases and framework to test a "pure" Kubernetes approach for some CMS analysis needs?

Other then "just" the interactive lab? Like for everything

Why?

- 1. Cloud-native community ecosystem compatibility
- Interoperability (buzzword!)
- 3. Declarative approach extended to the resource request!
- 4. Git-Ops native analysis?











Road to a cloud native analysis (a possible evolution path)

Let's try if we can use a container orchestrator to orchestrate... containers

Of course, in a special way, "offloading"* the execution to external endpoints

A user should not ever notice it! Just assigning their pods to a special cluster node where the magic happens!

Take home message: "We are kind of convinced to be ready for giving it a try"

*"Offloading" refers to the process of delegating the execution of a container to a remote resource instead of a physical node in your cluster.









Analysis/Training/Whatever in a Pod

When it makes sense?

You have tasks that can run in a "standalone" container.

Why?

You can reproduce it everywhere on any cloud Maybe accessing GPUs/resources with the least effort

How?

You need to practice Kubernetes basics. Pods spec is just a way to configure container execution

Is it enough?

ML/AI training and inference are an obvious use case, but also there, ancillary services might need some setup

See Raffaele's next presentation

```
piVersion: v1
kind: Pod
 name: itwinai-cern-use-case-training-run0
   slurm-job.vk.io/flags: "--gres=gpu:4 \
                            --job-name=itwinai \
                            --output=.local/interlink/jobs/itwinai/job.out \
                            --account=intertwin \
                            --mail-type=ALL \
 restartPolicy: Never
 containers:

    image: /p/project/intertwin/zoechbauer1/T6.5-AI-and-ML/use-cases/3dgan/containers/cern.sif

   command: ["/bin/bash"]
   args: ["-c", "\"cd /workspace/T6.5-AI-and-ML/use-cases/3dgan && python train.py -p pipeline.yam
   imagePullPolicy: Always
 dnsPolicy: ClusterFirst
   kubernetes.io/hostname: jul-vk

    key: virtual-node.interlink/no-sched

   operator: Exists
```



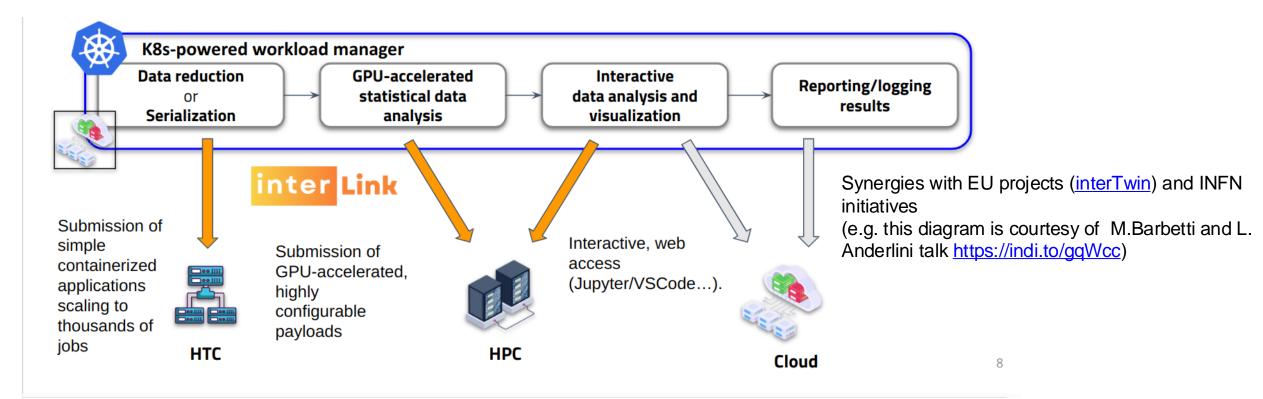






Matching different resources to different payloads... with one API

Evaluate the whole chain with CMS requires validation of each one of these steps with real use cases











Much more has yet to come...

Other use cases might be just around the corner.

Did you say inference?

Oh no, you said LLM/transformer...

Yes, <u>you can develop an Al app</u> seamless on supercomputers too! Thanks to the very same enabling technology

Diego Ciangottini

what if I have an analysis that has to create an histogram with the invariant mass of any di-muon system with 2 good muons?

Al Helix

To create a histogram with the invariant mass of any di-muon system with 2 good muons, you can use RDataFrame's GroupBy and Reduce functions. Here is an example code snippet:

```
import ROOT as R

# Create an RDataFrame from a TTree

df = R.RDataFrame("tree")

# Filter events where there are at least 2 good muons
filtered_df = df.Filter("n_muons >= 2 && n_good_muons >= 2")

# Group events by the two muon indices (i and j)
grouped_df = filtered_df.GroupBy(["muon_i", "muon_j"])

# Calculate the invariant mass of each di-muon system
invariant_mass = grouped_df.Reduce(lambda x, y: x + y, lambda x, y: x.InvariantMass(y))

# Create a histogram with the invariant mass
hist = R.THIF("di_muon_mass", "Invariant Mass of Di-Muon System", 100, 0, 10)

# Fill the histogram with the calculated invariant masses
invariant_mass.Foreach(lambda x: hist.Fill(x), num_threads=4)

# Draw the histogram
hist.Draw()
```

This code snippet first filters events where there are at least 2 good muons. Then it groups events by the two muon indices (i and j). For each group, it calculates the invariant mass of the di-muon system using the InvariantMass function. Finally, it creates a histogram with the calculated invariant masses.









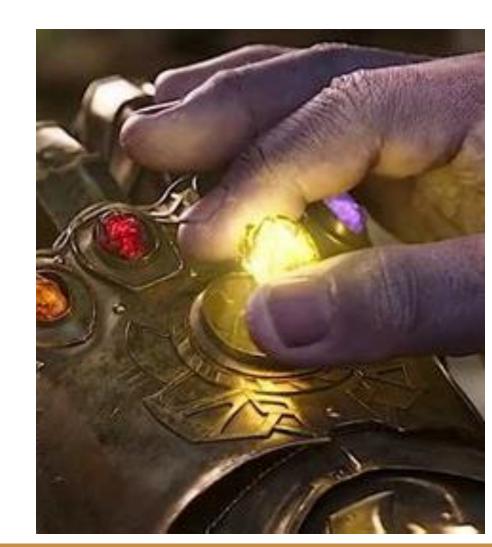
Do we have the full set?

We do want to understand/demonstrate if we can deliver what I just presented for CMS analysis

Where are the bottlenecks, maintenance costs, limitations, etc...

This are the kind of things for which experience with real-world use cases is key at the moment!

In other words...











Call to action

We know that we can validate/refine/retune our hypotesis with CMS analysis users see Raffaele example in a few mins

Things are ready to support new/advanced use cases:

- 1. Reach out for accessing resources
- 2. Provide feedback
- 3. Try again and repeat

Of course, open to ANY more detailed feedback from Physics goal and requirements

If I had to sell it, I'd tell you that in this way you can get extra resources for free... plus learning tools and techniques that are cutting edge.









Just some final references for geeks

https://intertwin-eu.github.io/interLink/





