



# The CERN Quantum Technology Initiative

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# CERN

“Science for peace”

International organisation close to Geneva, straddling Swiss-French border, founded 1954

Facilities for fundamental research in particle physics

23 member states,  
1.1 B CHF budget

~3'200 staff, fellows, trainees, ...

>13'000 associates

1954: 12 Member States

**Members:** Austria, Belgium, Bulgaria, Czech republic, Denmark, Finland, France, Germany, Greece, Hungary, Israel, Italy, Netherlands, Norway, Poland, Portugal, Slovak Republic, Slovenia, Spain, Sweden, Switzerland, United Kingdom

**Candidate for membership:** Cyprus, Slovenia

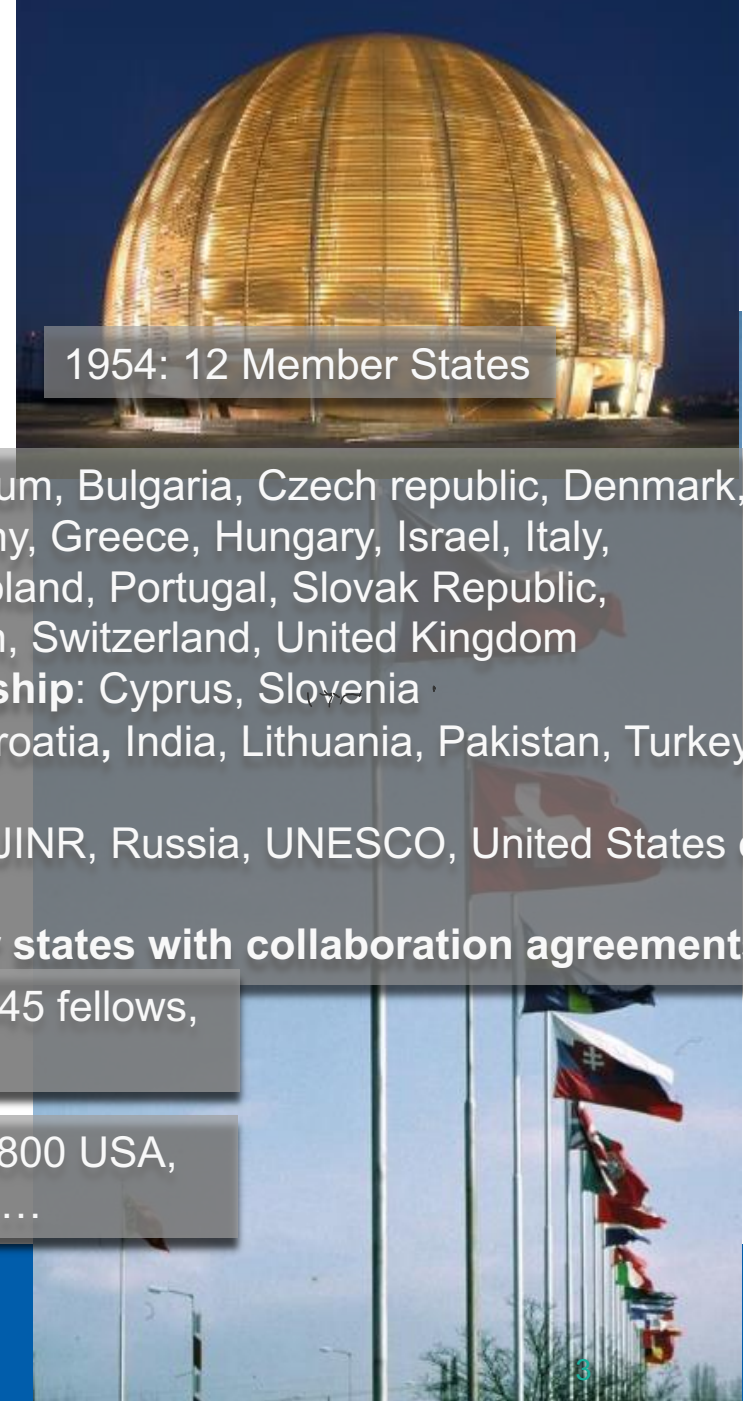
**Associate members:** Croatia, India, Lithuania, Pakistan, Turkey, Ukraine

**Observers:** EC, Japan, JINR, Russia, UNESCO, United States of America

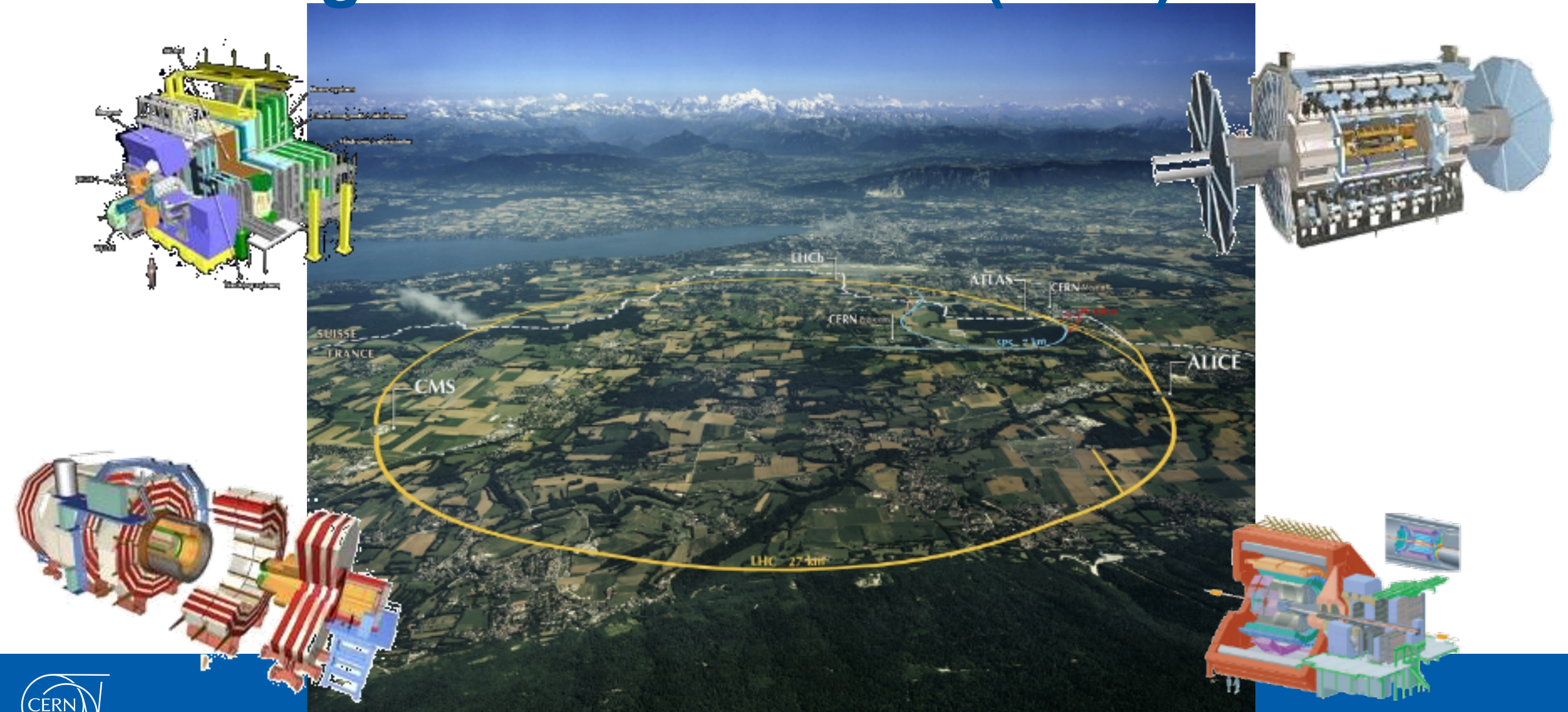
Numerous **non-member states with collaboration agreement**

>2'500 staff members, 645 fellows, 21 trainees

7'000 member states, 1'800 USA, 900 Russia, 270 Japan, ...

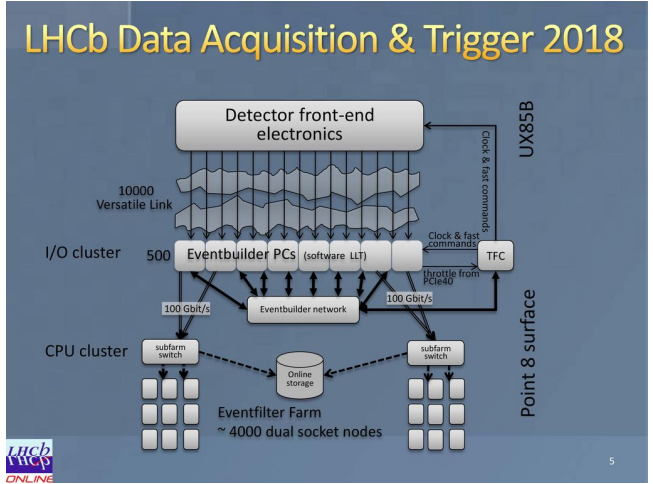


# The Large Hadron Collider (LHC)



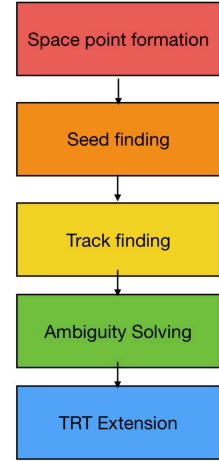
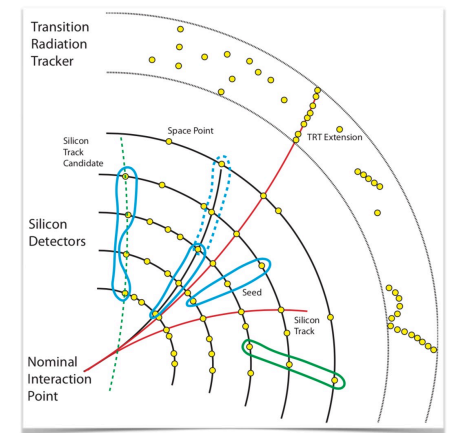
# Typical LHC Experiments Workloads

© Niko Neufeld - LHCb

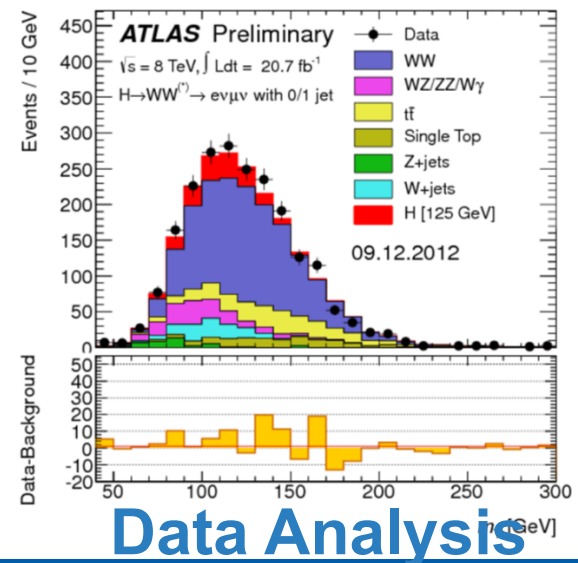


## Data Acquisition

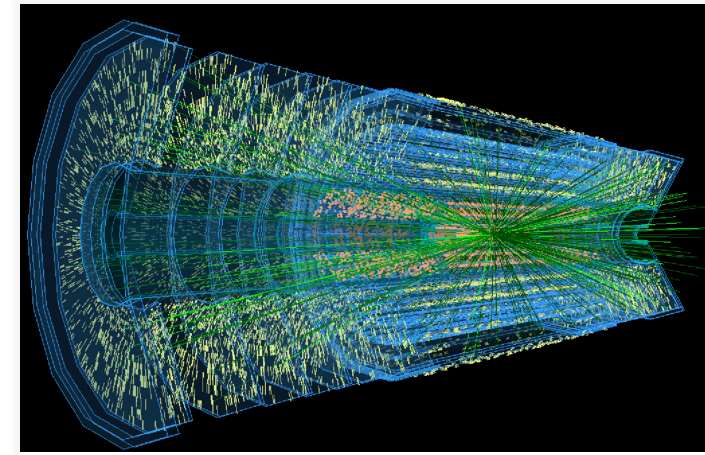
Multi-step iterative Kalman filter approach



## Track Reconstruction



## Data Analysis



## Simulation



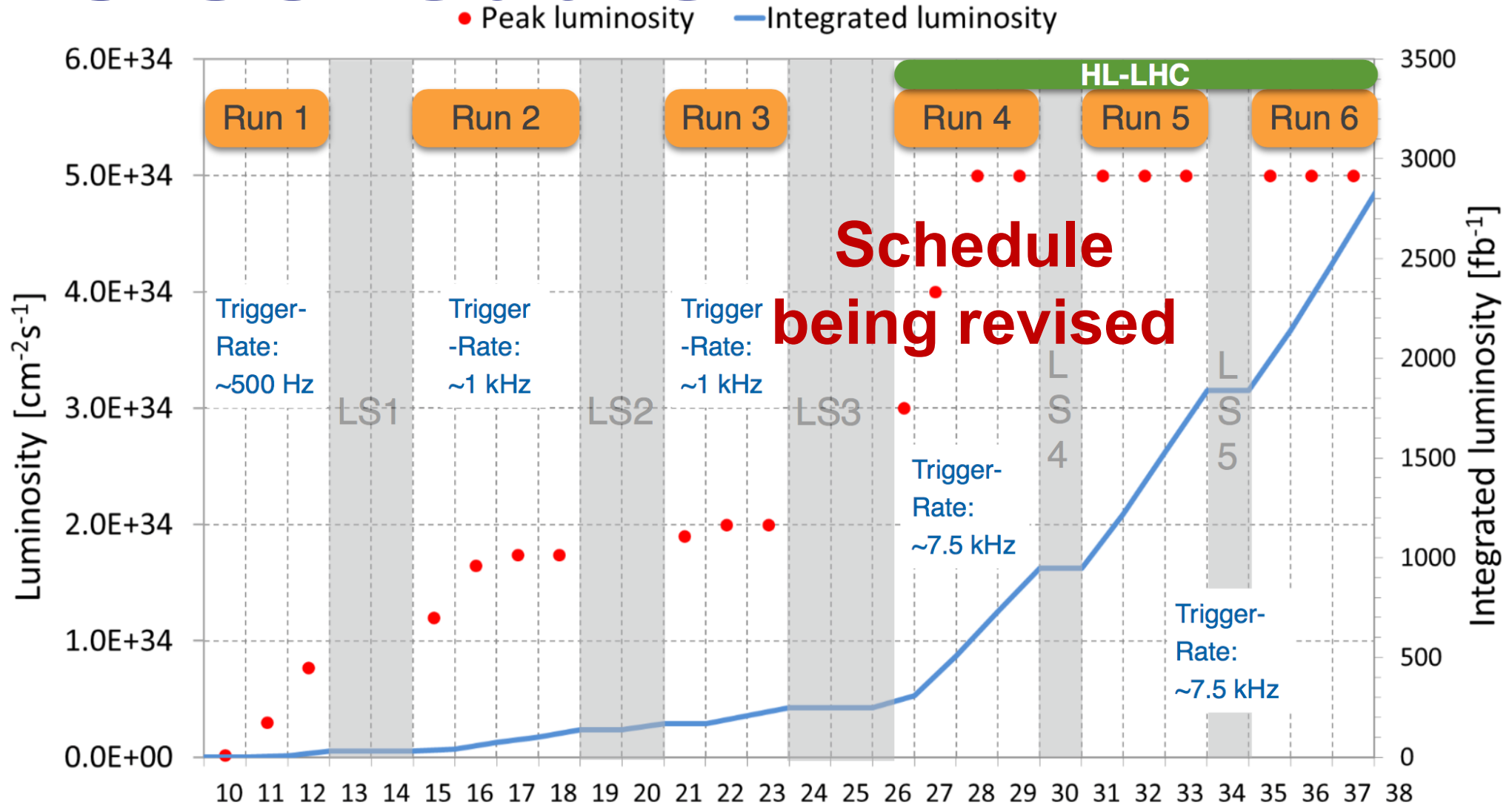
The Higgs Boson completes the Standard Model,  
but the Model explains only about 5% of our Universe

What is the other 95% of the Universe made of?

How does gravity really works?

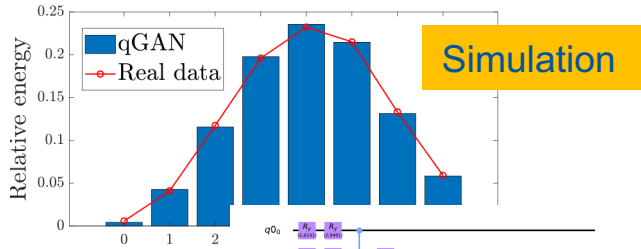
Why there is no antimatter in nature?

# LHC Schedule

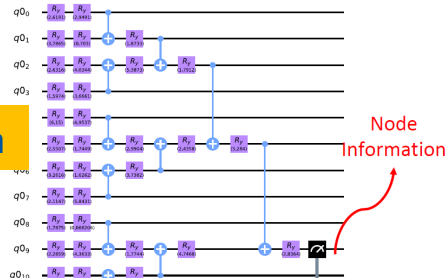


# CERN Unique Expertise and Activities

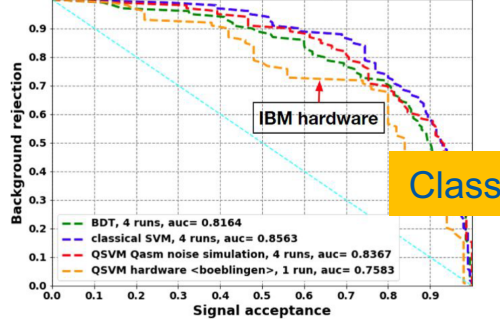
## Computing



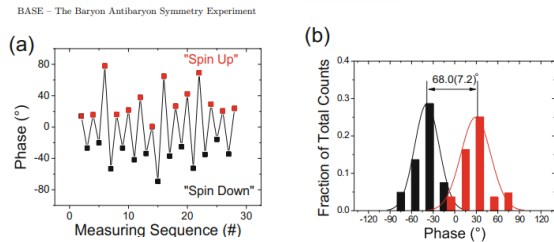
## Reconstruction



ttH ROC Curve for 100 events, 1000 iterations

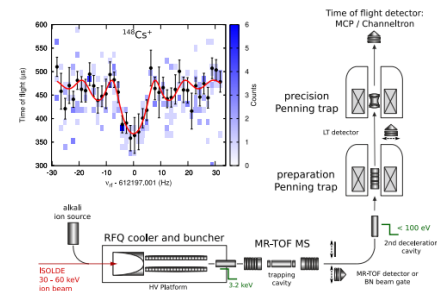


## Sensing



<https://doi.org/10.1140/epjst/e2015-02607-4>

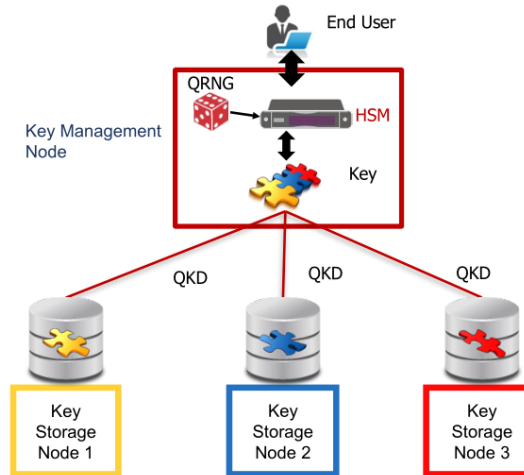
BASE phase-sensitive measurement of spin allowing very precise magnetic field drift measurements



<https://doi.org/10.1088/1361-6471/aa5a20>

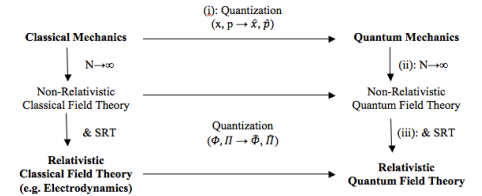
ISOLTRAP Mass-Spec

## Communications

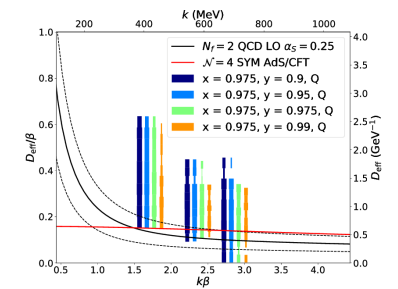


QKD node  
Secure Data

## Theory



Quantum Field Theory



<https://cds.cern.ch/record/2703396>

Lattice QCD

Many pilot projects already started as part of the **CERN openlab quantum** programme (<https://openlab.cern/quantum>)



# 1<sup>st</sup> CERN Quantum HEP Workshop

- CERN openlab has organized a kick-off event of its Quantum Computing initiative on **November 5<sup>th</sup>-6<sup>th</sup> , 2018**
  - <https://indico.cern.ch/event/719844/>
  - > 400 registered participants from the HEP physics community, companies and worldwide research laboratories and beyond
- Create a database of QC projects to foster **collaborations** between interested **user groups, CERN openlab and industry**
- Continue to seek **opportunities** to support QC projects
- **CERN is now investigating ways of scaling up the QC activities in 2020**

# CERN Quantum Technology Initiative

Strategy



Joint HEP R&D Programme



CERN Management



QT Advisory Board (Member States)

Coordination



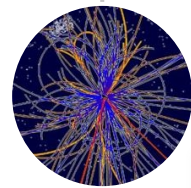
QT Initiative Management



R&D



Sensing, Detectors R&D



Computing & Engineering



Communication



Simulation, Information Processing

Capacity building

Academic Programmes / Industrial Collaborations / Knowledge Transfer

# High-Level Objectives



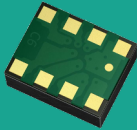
## Computing

- Assess the potential and role of QML in HEP workloads, work on optimization and more robust mathematical formulations
- Build expertise in the state-of-the-art of the software stack (simulators, compilers, programming models/languages/tools)
- Work on quantum systems simulators (FPGA?)
- Set up a distributed QCS platform



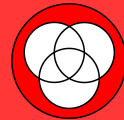
## Communications

- Explore possible applications of QKD
- Comms+sensing for detectors?
- European Quantum Network/Internet



## Sensing

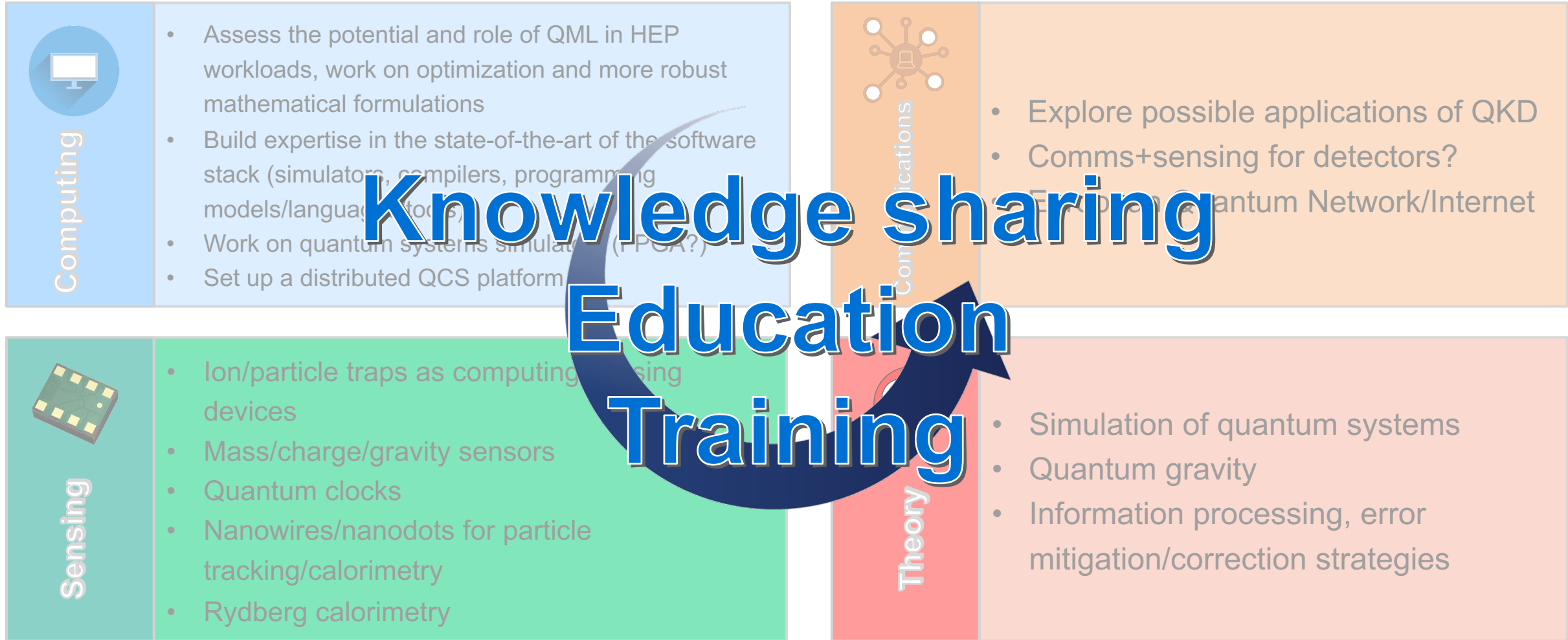
- Ion/particle traps as computing/sensing devices
- Mass/charge/gravity sensors
- Quantum clocks
- Nanowires/nanodots for particle tracking/calorimetry
- Rydberg calorimetry



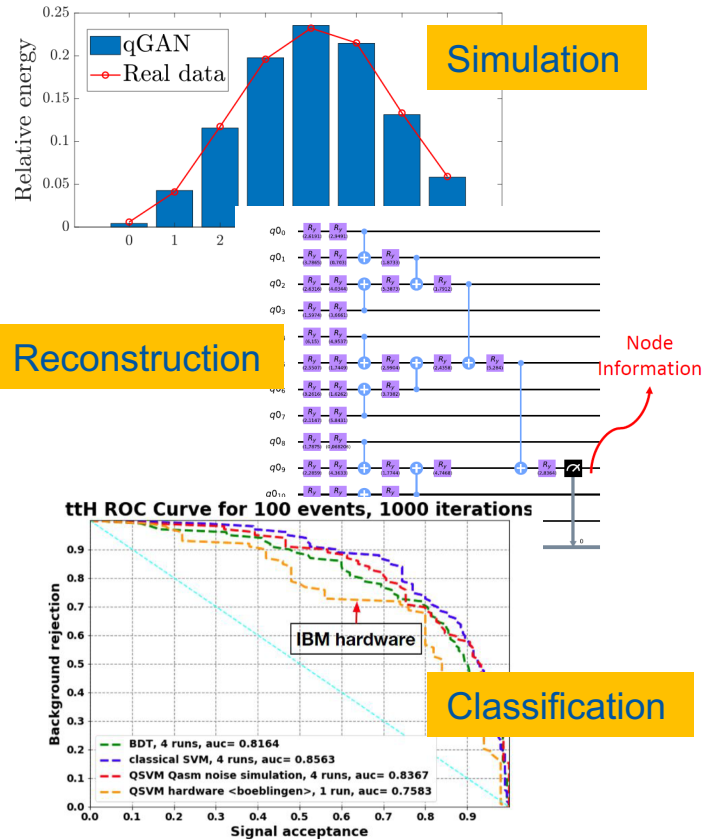
## Theory

- Simulation of quantum systems
- Quantum gravity
- Information processing, error mitigation/correction strategies

# High-Level Objectives



# Quantum Computing Projects



- Quantum **Generative Adversarial Networks** for detector simulation
- Quantum **Graph Neural Networks** for particle trajectory reconstruction
- Quantum **Support Vector Machines** for signal/background classification (Higgs, SUSY,...)
- Workload optimization via quantum **Reinforcement Learning**
- Quantum **Random Number Generators** tests and integration
- Quantum **Homomorphic Encryption**

# Quantum Generative Models

Classical Generative Models can replace Monte Carlo simulation

**3DGAN: Generative Adversarial Networks** for calorimeter simulation

Detector output interpreted as a 3D image.

Quantum Generative Models might have **larger representational power**

Quantum GAN investigations:

Down sample 3DGAN use case to **manageable number of pixels**

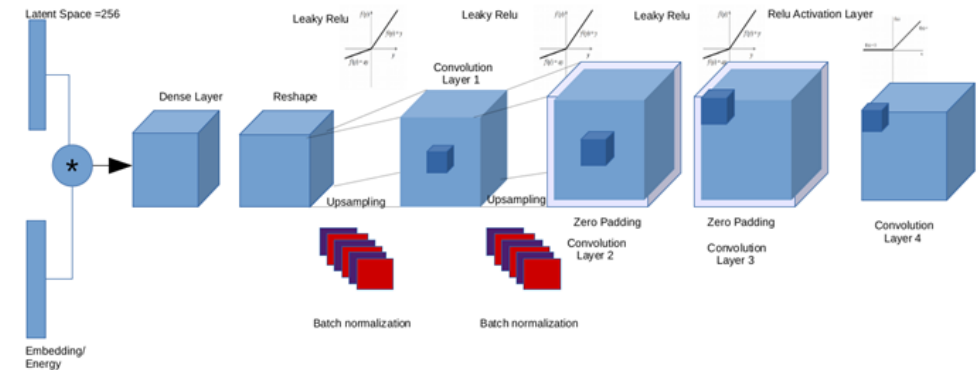
**Compressed data representation** in quantum states.

**Qubits or Continuous Variables**

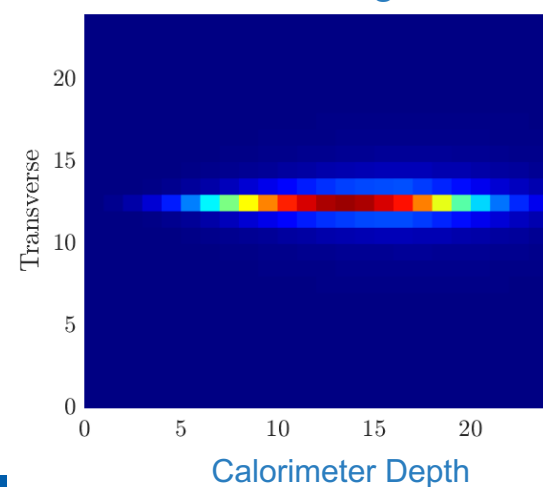
Different **hybrid** classical-quantum combinations

## 3DGAN generator

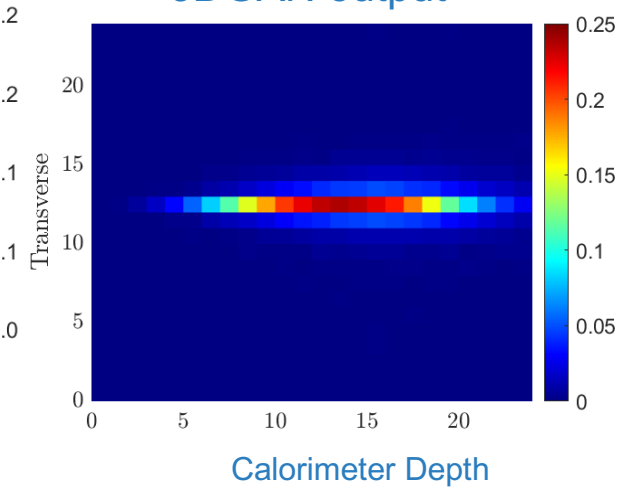
<https://doi.org/10.1051/epjconf/201921402010>



Real image



3DGAN output



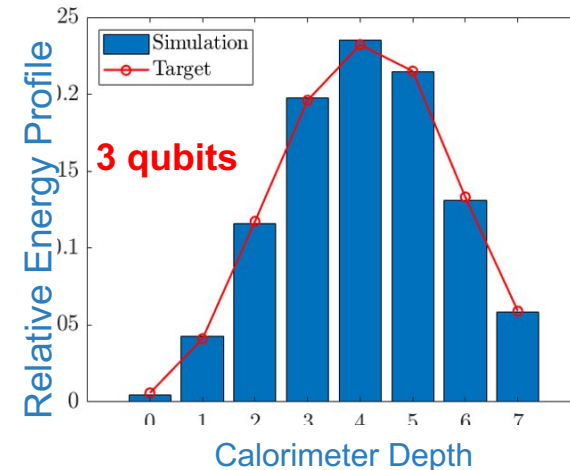
# Hybrid Classical-Quantum GAN

IBM qGAN can load probability distributions in quantum states

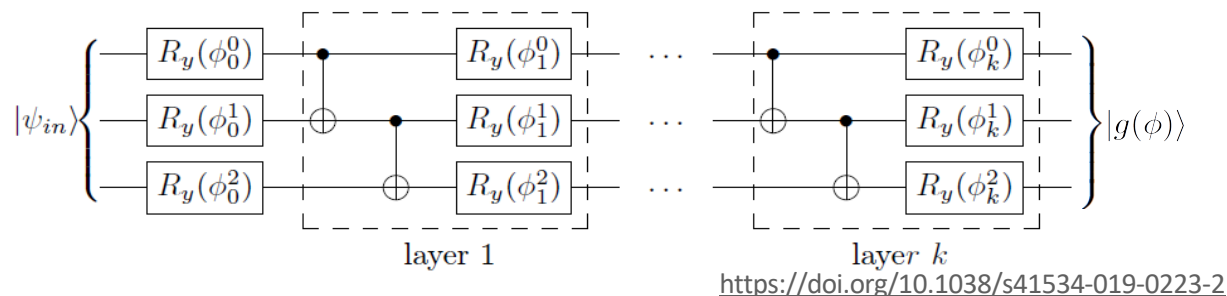
1D & 2D energy profiles from 3DGAN images

$2^n$  classical pixels expressed by  $n$  qubits

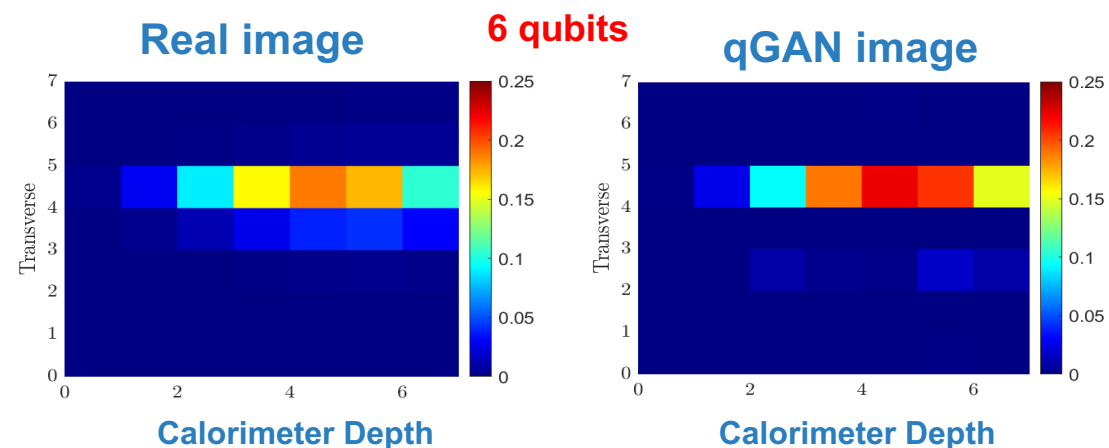
Train a hybrid classical-quantum GAN to generate **average image**



Quantum Generator: 3  $R_y$  layers



Need a way to sample single images



# Extending the qGAN model

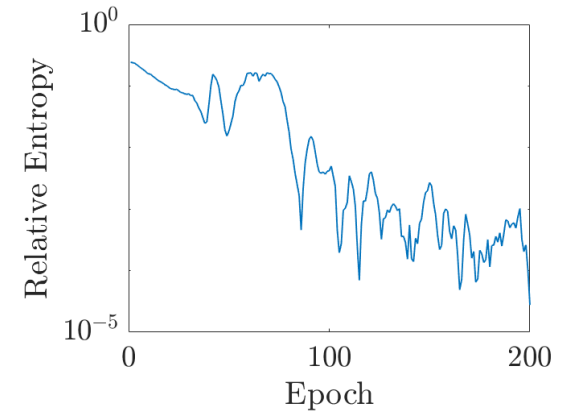
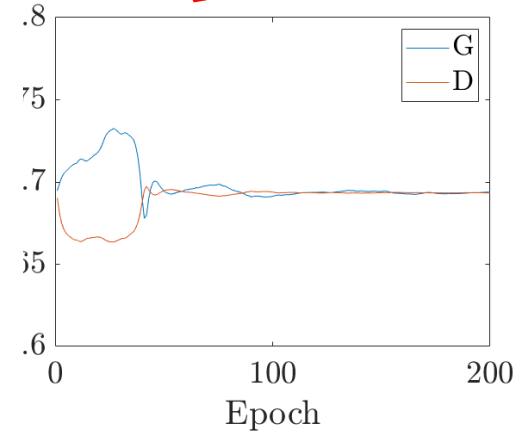
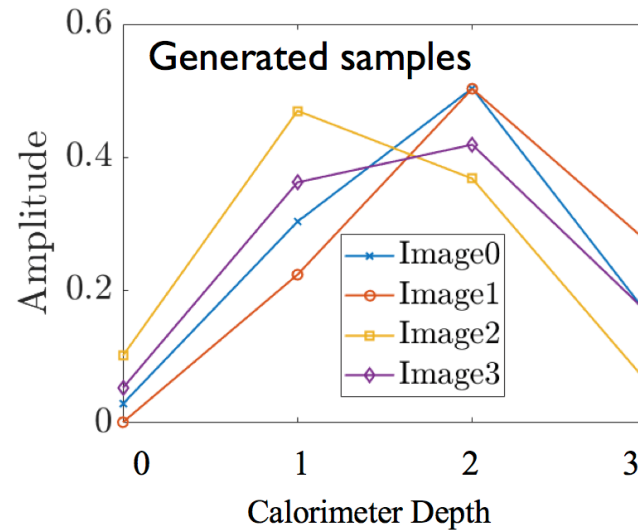
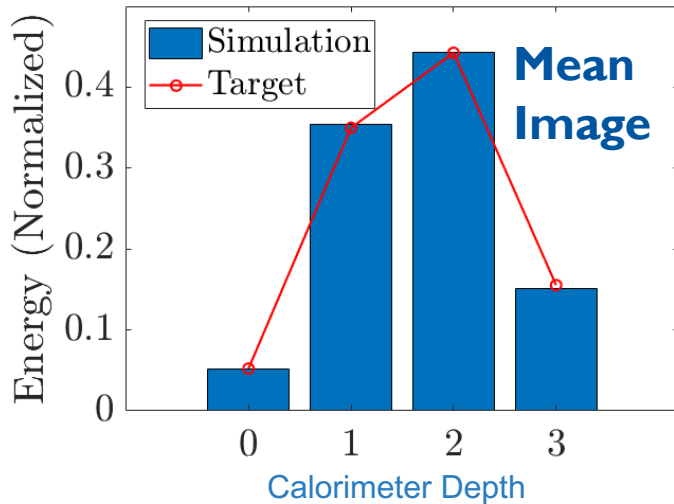
*Collaboration with Cambridge Quantum Computing*

**Two-steps quantum generator** to learn the average distribution and sample images from it

Ry variational form implemented using **qiskit & t|ket**

Classical discriminator (pyTorch) 4 nodes → 512 nodes → 256 nodes → 1 node

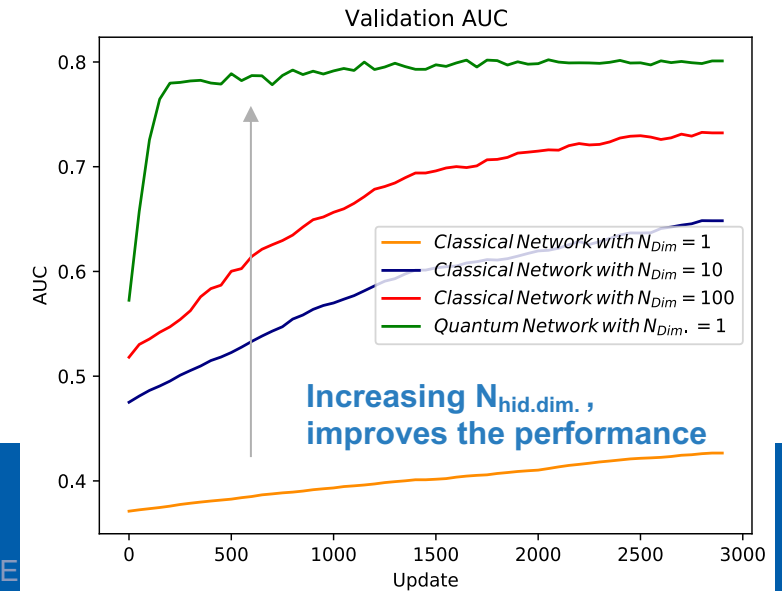
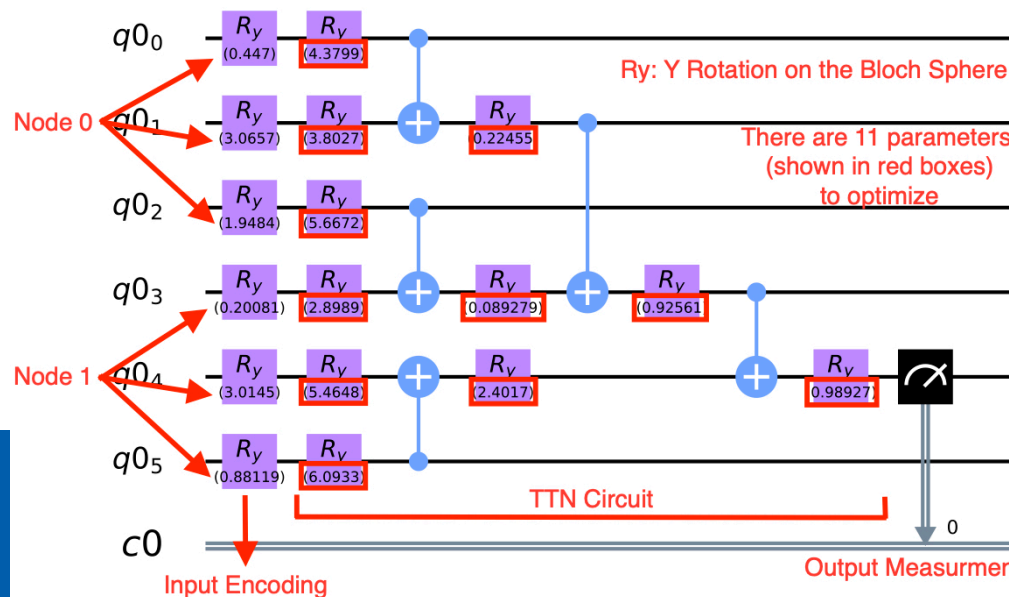
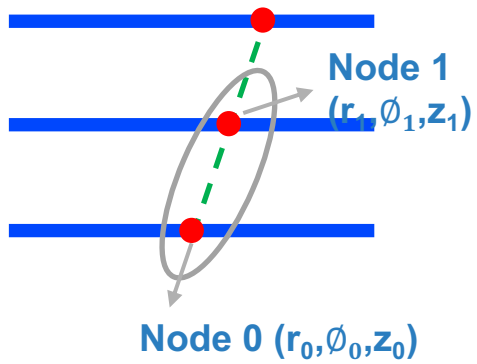
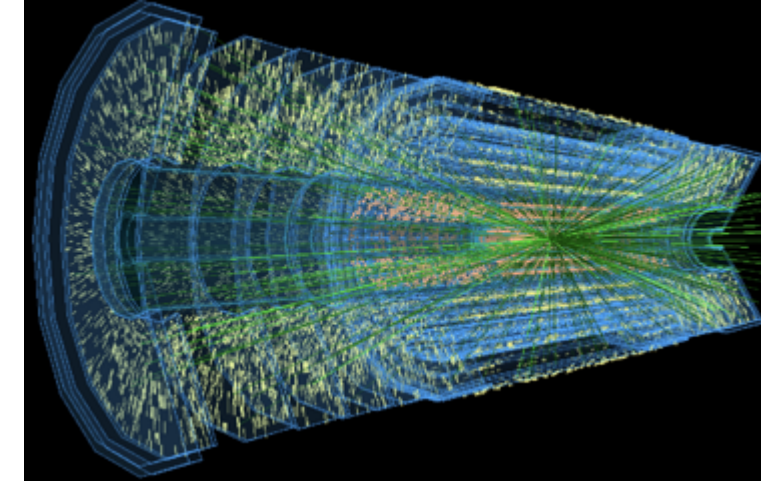
**WORK IN PROGRESS**





# Quantum TTN for tracking

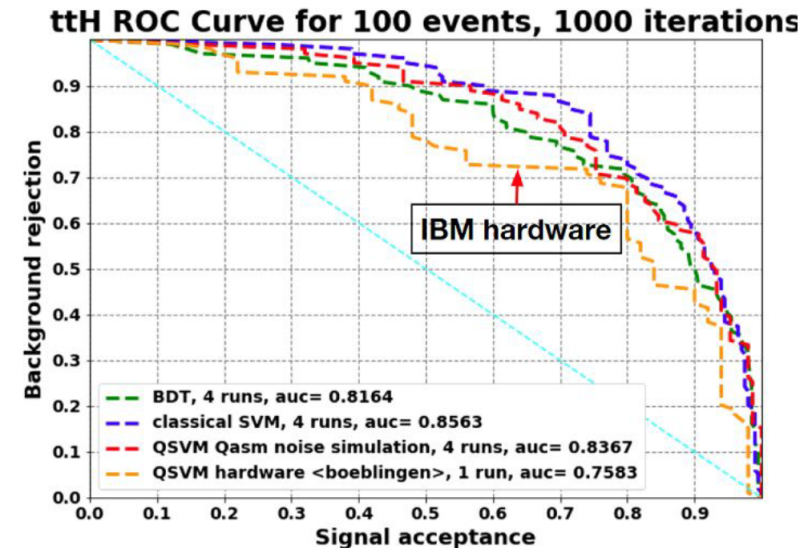
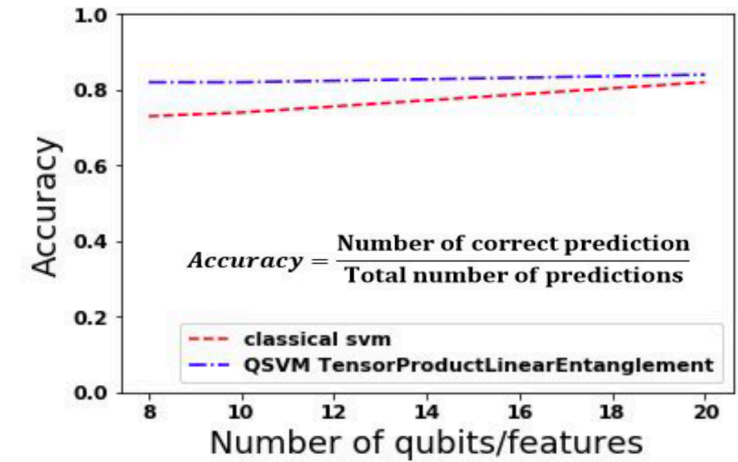
- **Q-TrKx project** designs a cascade of TTN to perform trajectory reconstruction from detector digital hits
  - Mimics classical GNN based approach (**HEPTrk**)
  - Realistic dataset used for TrackML challenge
- Comparison to simple classical networks shows **quantum potential**



# Quantum SVM

A quantum classifier for Higgs boson identification:  $ttH(H \rightarrow \gamma\gamma)$

- 45 signal/background classical distinctive features
  - Reduce number using PCA (5 qubits)
- Implement a Support Vector Machine as **Variational circuit in Qiskit**
- Comparison to classical BDT and SVM
  - 1000 iteration on IBM boeblingen
- Quantum simulation requires **large computing resources**
  - **Memory increases** with qubit, training events and complexity



ttH(H→γγ) AUC	AUC
Classical SVM	0.856
XGBoost BDT	0.816
QSVM Simulation with Noise	0.837
QSVM Hardware	0.758

# QC Simulation Platform

1

Enable building skills and starting R&D work, both as a preparation to real H/W and to explore “quantum-inspired” computational models

2

“Standardized” access to different simulators, hardware, tools, libraries (e.g. pre-packaged containers, Jupyter notebooks, GitHub, etc.)

3

Multiple participating sites, capitalizing on CERN world-level expertise in operating distributed infrastructures

# Quantum Sensing and Low-Energy Physics

Scope

Low-Energy Physics: antimatter, dark matter searches, symmetries, EDM's (AD, AeGIS, ISOLDE, etc.)

Strategy

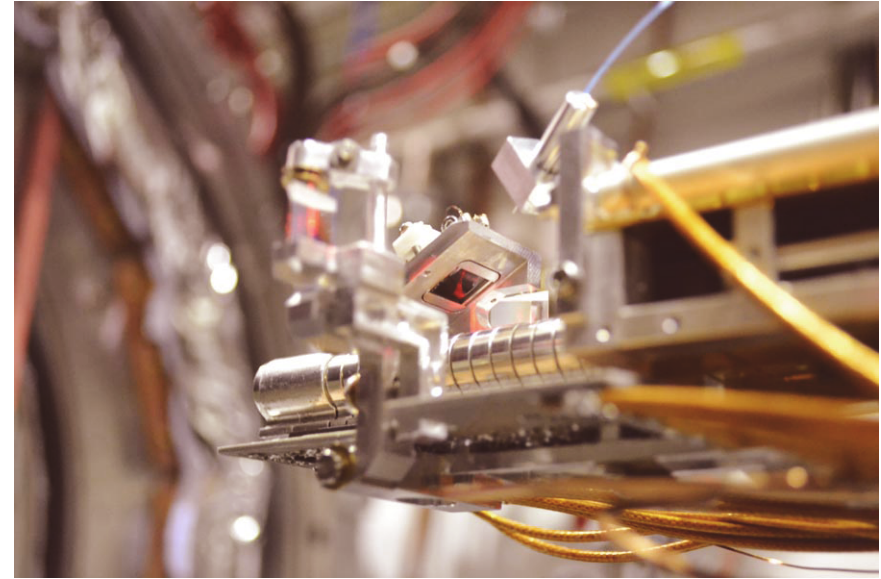
Discrete processes, changes of quantum states

Applications

**Novel devices:** nanowires, photon upconverters, microwaves, magnetic junctions, SQUIDs, TES

**Measurements** of properties of trapped, atoms, ions, molecules, Rydberg atoms, neutral systems

**Correlations of entangled systems:** e.g.  $e^+ e^- 3\gamma$  decay: simultaneous measurement of E, polarization and direction



# Quantum Sensing for High-Energy Physics

## Scope

High-Energy Physics, particle tracking, calorimetry, identification in HEP detectors

## Strategy

Quantum “priming” of detectors before measurement, signal enhancement by laser excitation, quantum effects due to size, cryogenics

## Applications

Chromatic particle trackers composed of arrays of nanodots of varying size, Calorimeters and low-energy single-particle (photons, mip's, ions,...) detectors made of arrays of nanowires (SNSPD)  
“Rydberg-amplified” calorimeters with high  $dE/dx$



# Quantum Internet

1

CERN started the Web; we have some expertise it's in our DNA 😊

CERN was part of early quantum networks experiments already 10+ years ago

2

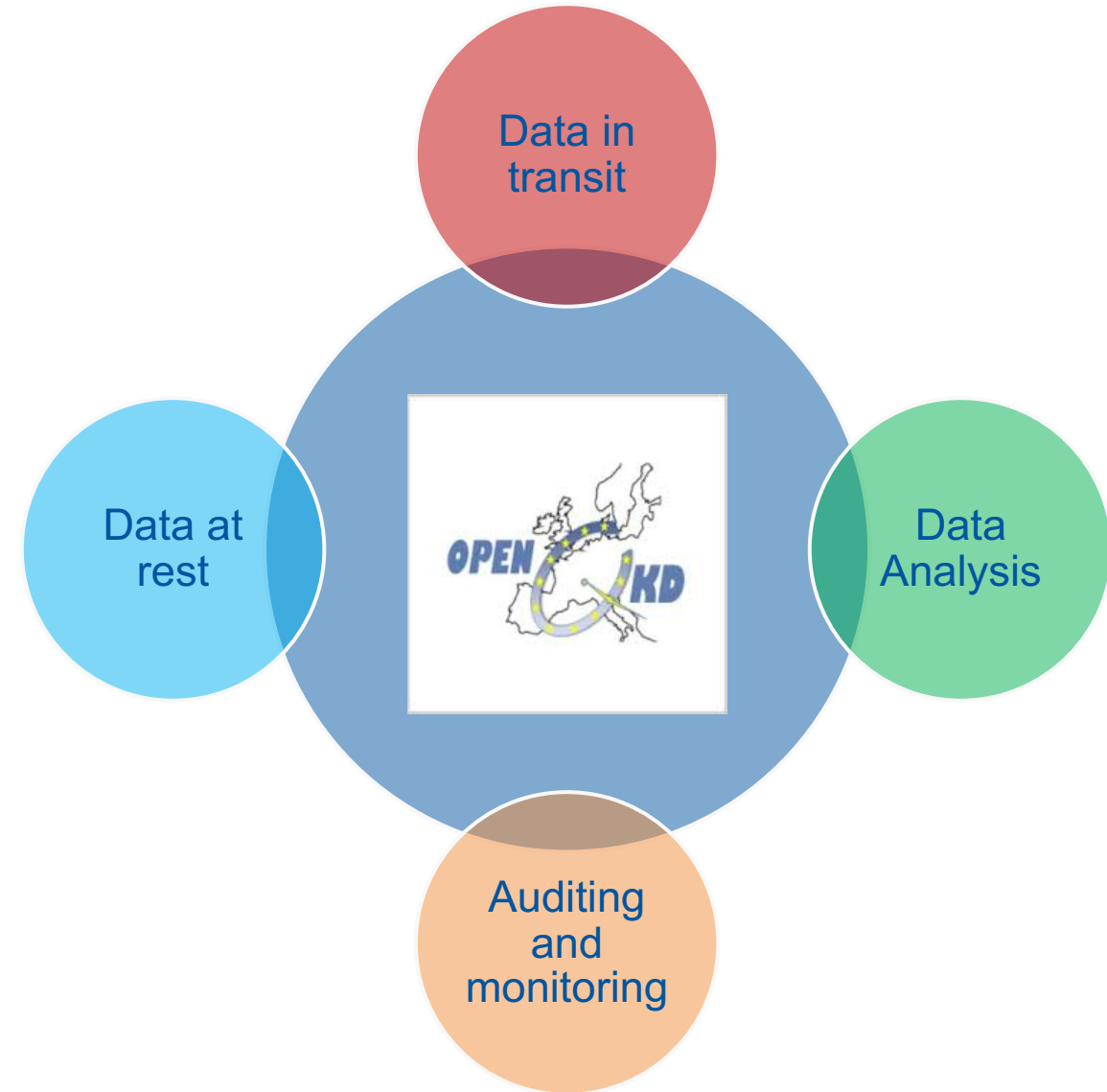
Interested in taking part in EU and international network deployment initiatives

Quantum memory/storage would be necessary for our typical “big data” models

3

# QUANTUMACY

- **QUANTUM-based privacy and self-determination**
- Funded as an openQKD open call funds
- End-to-end use of QKD to secure distributed data analysis over cloud infrastructures
- Data analysis: **quantum homomorphic encryption**
- Auditing: **quantum block chains**
- Medical use cases: image classification and segmentation for neurological diseases research



# Numerical Methods and Simulations in Particle Theory

Modern day HEP requires high performance computing, relying on Monte Carlo simulations

- Mass Spectrum and Scattering in Low Energy Nuclear Physics
- Hadronic contributions to BSM Experimental Searches
- Event generation for Particle Collisions

Main focus is developing methodologies and algorithms that would allow us to address these questions using quantum computers, without relying on importance sampling

But not every physics problem is amenable to Monte Carlo simulation

- Nuclear Physics at Finite Density (sign problem)
- Interference effects in Parton Showers (must work at amplitude level)
- Transfer Phenomena (must work in real time)
- Baryonic Physics (signal to noise problem)



# CERN Quantum Technology Initiative

Accelerating Quantum Technology Research and Applications

<https://quantum.cern/>

## Thanks!

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