

## **Quantum Computing Solutions for High-Energy Physics**

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**QuantHEP - Quantum Computing Solutions for High-Energy Physics** QuantERA project, 2020-2023



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**State Education** Development Agency Republic of Latvia







**Written in 2018, submitted in 2019, kicked-off in Lisbon in January 2020, with the goals to:**

- **1. Investigate the potential of quantum computation for particle tracking and event selection.**
- **2. Develop the quantum simulation of events.**
- **3. Promote the collaboration between the Quantum Computation / Quantum Technologies and the HEP communities.**











The problem of particle tracking

## **The Tracking Problem**







CMS Experiment at LHC, CERN Data recorded: Thu Apr 5 01:18:00 2012 CEST Run/Event: 190389 / 107592030 Lumi section: 138

Compact Muon Solenoid (CMS) detector

To identify the particles created in these collisions and scattered in all directions, we need to reconstruct their trajectories: tracking.

## **Tracking: a challenging computational problem**





## **Tracking: a challenging computational problem**



**If computational performance does not meet the increasing demand, in HL-LHC or in the 100 TeV potential FCC, an immense amount of data will have to be discarded, significantly reducing the chances of observing rare events!**

How hard is particle tracking?

## **Global vs. Local Methods**

Global methods of pattern recognition

have the common property to treat all

hit information in an equal and unbiased

way.

Essentially, they are clustering algorithms in some feature space.

Local methods reconstruct tracks one by one.

The algorithm that we describes is an typical example of this class.



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## **Combinatorial Track Finder**

The CMS Collaboration,

*Description and performance of track and primary-vertex reconstruction with the CMS tracker*, Journal of Instrumentation **9**, 10009 (2014).

- ➢ **Seed generation:** Start with initial estimates of the track parameters (seeds).
- ➢ **Track finding:** Propagate tracks from layer to layer with Combinatorial Kalman Filter. Stop when outermost layers are reached.
- ➢ **Track cleaning:** Eliminate tracks corresponding to same particle.
- ➢ **Track fitting:** Smooth the trajectories.
- ➢ **Track selection:** Select based on quality criteria.

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### **We want to develop a computational complexity analysis of this algorithm, and namely of these 5 stages, to:**

- Establish formally how efficient this algorithm is.
- Investigate if it is optimal, or if it can be improved…
	- ... including with quantum computation.



TABLE I. Summary of the results. We present the complexity of the algorithms for each of the track reconstruction stages, both the classical and quantum versions.  $n$  is the number of charged particles present in the event record,  $c$  is the number of hits used to form the seeds,  $k_{\text{seed}}$  is the number of seeds generated, and  $k_{\text{cand}}$  is the number of built candidate tracks. The two



## Paraphrasing the Monty Python: Every speed-up is special, every speed-up is sacred!



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## Jet Clustering



## Adiabatic Quantum Algorithm for Multijet Clustering

- A novel quantum annealing binary clustering algorithm
- Outperforms the Thrust algorithm

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Can be extended to any number of jets



Figure 2: Histogram of the obtained efficiency for the Thrustbased algorithm by Wei et al. [3],  $\epsilon_{\text{Thr}}$ .



Figure 1: Histogram of the obtained efficiency for the proposed quantum binary clustering algorithm,  $\epsilon_{\text{OBC}}$ .

Diogo Pires, Yasser Omar, João Seixas *Adiabatic Quantum Algorithm for Multijet Clustering in High Energy Physics* arXiv:2012.14514 (2020)

## A Digital Quantum Algorithm for Jet Clustering

- The first digital quantum algorithm to tackle jet clustering. Based on quantum k-means.
- Comparable, yet generally lower complexity relative to the classical state-of-the-art kt clustering algorithm.



**Figure 7.** Histograms of the obtained efficiencies  $\varepsilon$  (on the left), number of found meaningful jets K (middle), and heatmap of the number of jets found by the proposed algorithm against those found by the  $k_t$  benchmark for a jet  $p_T$  cutoff of 1 GeV.

> Diogo Pires, Pedrame Bargassa, João Seixas, Yasser Omar *A Digital Quantum Algorithm for Jet Clustering in High-Energy Physics* arXiv:2101.05618 (2021)



## Quantum algorithm for the classification of supersymmetric top quark events

**Motivation: Improve approach based on zoomed Quantum Annealing (QA) for classification of stop events**

- Run on Chimera graph of D-Wave
- Put QA on equal footing vs classical Machine Learning (ML) tool:
	- ⚫ based on same variables to build a strong classifier R
- ⚫ prepare data w Principal Component Analysis before feeding to QA
- Explore many sets of variables & augmentation schemes

 $O.5$  $O.O$  $-0.2$  $-0.6$  $-\dot{\mathrm{o}}$ .4  $O.O$  $O.2$  $O.4$ R **Figure of Merit** including stat. & sys. uncertainties: more complete than Efficiency(S) vs Efficiency(B): **BDT: 1.44 ± 0.06 QA: 1.57 ± 0.24**

### **Promising: QA performs at least as well as classical Machine Learning**



P. Bargassa, T. Cabos, A. Oudot, T. Hessel, S. Cavinato, Physical Review D **104**, 096004 (2021)



### Tensor Network Machine Learning: LHCb data analysis

**Goal/Motivation**: generalization and application of quantum-inspired tensor network algorithms to a very challenging machine-learning problem in high-energy physics: the analysis and classification of data produced by the Large Hadron Collider at CERN.

### **Key results:**

- study of efficient protocols for encoding machine learning problems in tree tensor network (TTN) architectures;
- classification of the charge of b-quarks (i.e. b or  $\overline{b}$ ) produced in proton–proton collisions at LHC with TTN algorithms;
- analysis of the performances of TTN algorithms and comparison with standard neural-network approach.

### **Paper reference: npj Quantum Inf 7, 111 (2021)**





#### (3+1)D Quantum Electrodynamics at finite density with Tensor Networks 0*.*4 **h** Tenso 2 *nx° even* ⇢ *n*x *−* even 0*.*4  *Τ<sub>σ</sub> even* **th Ter**

Goal/Motivation: generalization of sign-problem-free tensor network methods to high-dimensional lattice gauge theories (LGTs).  $\cdot$ free ter *y* 1  $\sqrt{2}$ <u>17</u> *g* 2m = 0 1-tree tensor network lem-free ≏r ۱ ۲۱

### **Key results:**

- extension of high-performance tensor network algorithms to (3+1)D LGTs; 1 2
- study of the low-energy phase diagram of 4 Quantum Electrodynamics (QED) at zero and finite charge density; namics *y* --11  $\mathbf{1}$  $\ddot{\phantom{0}}$ *even* even 0 *<sup>n</sup>x° odd* 1 *n*<sup>x</sup> *<sup>−</sup>* o dd
- analysis of the confinement properties of the QED model at weak and strong coupling; **d e f**
- study of non-perturbative chargescreening effects**.**

### Paper reference: Nature Communications 12, 3600 (2021)





### Tensor Networks for scattering dynamics in (1+1)D QED

**Goal/Motivation**: development of tensor network protocols for preparing initial meson wave packets with given momentum and position, and simulation of the realtime dynamics of scattering events in lattice gauge theories.

#### **Key results:**

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- analysis of efficient strategies for encoding meson wave packets on tensor network algorithms;
- simulation of the real-time dynamics of two initially separated colliding mesons in (1+1)D Quantum Electrodynamics.
- measurement of scattering amplitudes and entanglement generated by the scattering process;
- identification of two different regimes for the asymptotic entanglement.

**Paper reference: Phys. Rev. D 104, 114501 (2021)**



## Leptonic CP violation and neutrino entanglement

• We show how a minimization of quantum entanglement between the oscillating flavors of a neutrino leads to a unique prediction for the CP-violation phase in the neutrino sector without assuming extra symmetries in the Standard Model.



**Figure 3.** The concurrences between all possible pairs of neutrino flavors, for all initial neutrino flavors possibilities. It is found numerically that the global minimum of all these functions is achieved for the electron/tau neutrino flavor case, starting with an initial electron neutrino. All free parameters apart from  $\delta_{CP}$  are fixed according to the most recent experimental data [19].

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Gonçalo M. Quinta, Alexandre Sousa, Yasser Omar *Predicting leptonic CP violation via minimization of neutrino entanglement* arXiv:2207.03303 (2022)



#### **QuantHEP - Quantum Computing Solutions for High-Energy Physics** QuantERA project, 2020-2023



#### Welcome to the QuantHEP project website

QuantHEP - Quantum Computing Solutions for High-Energy Physics is a research project whose key goal is to develop quantum algorithms as a solution to the increasingly challenging, and soon intractable, problem of analysing and simulating events from large particle-physics experiments.

Project QuantHEP bring together researchers from the Physics of Information and Quantum Technologies Group at Instituto de Telecomunicações in Portugal, from the National Institute for Nuclear Physics in Italy, and from the Quantum Computing Group of the University of Latvia.

#### **Upcoming Events**

**OuantHEP Conference** 12-14 June 2023, Bari, Italy

#### View all the events

#### **Latest Publications**

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- **200+ events covering Africa, the Americas, Asia, and Europe!**
- **Launched Quantum@School and Quantum@Museum projects.**
- **Join QuCATS in celebrating the World Quantum Day in 2023!**
- **14 April: European Quantum Day?**



