



## Al in ALICE

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### **Current impact Al**

- 1.1) What are the physics areas of application where AI is having a major impact internationally in production use in your research area?
- Briefly sketch the purpose of application and what ML/AI architectures/techniques are currently used (LLM, GNNs etc...) along any with major computing resource requirements (for training / for application)
- Cut optimization: simple models
- Heavy-flavour tagging: deep neural networks
- Track reconstruction in Inner Tracking System and MFT: cellular automaton
- Jet energy calibration and background subtraction: deep neural networks
- Rare signal hunting and anomaly detection:
  - Unsupervised because physics and type of signal is unknown
  - reinforcement learning (for example LSTM), transformers

#### Involvement Nikhef scientist

- 2.1) Are you involved in or internationally leading in R&D\* on the application of AI/ML methods in your research area? Or are you mainly 'end-users'?
- We did development of an algorithm from scratch for one project, but this is better left to the computing scientist.
- There are interesting opportunities for us combining different tools. For example a transformer with One Class SVDD.
- 2.2) Who are the in-house experts? What is their expertise?

Please distinguish staff vs PhD/PD expertise.

- Alessandro Grelli: DNN on FPGA, domain adversarial neural net (DANN)
- Marta Verweij: LSTM, One Class methods, transformers. All supervised
- Plenty of PhDs, and BSc+ MSc students

### Involvement Nikhef scientist

2.3) To what extent use MSc/BSc projects in your group focus on AI/ML use?

Do you have experience with Comp.Science (AI) and/or Math students (Bsc/Msc/PhD) in your group working AI/ML in physics?

- Many of our students (~70%) at all levels do projects involving AI
- Collaboration with mathematicians at Utrecht University. Especially fruitful with our physics+math TWIN bachelor students
- 2.4) Are you (at Nikhef) using Al-based coding assistance tools?
- Some of our researchers use it to speed up their progress. Expect to get better and more important for day-to-day activities.

## Al next years – midterm (2-4 years)

What is the expected ML/AI use in your research area in the next years?

• 3.1) Extrapolating from current experience, where will future/improved deployment of ML/Al

bring strong gains in physics performance in the next few years?

What AI/ML techniques do you expect to perform strongly in the near future

(LLMs, foundation models, simulation-based inference, generative models etc etc)

Inference and explainability. Especially when looking for unknown signal it is important to understand why the machine is making certain decisions.

Broader and more-controlled use in physics data analysis on all topics, especially considering the much larger data rates in ALICE in run 3.

• 3.2) Are there major novel ML/Al application areas in the pipeline? (i.e. areas where ML is now not used)

#### Areas to explore:

- detector simulation. GEANT simulation are currently a bottleneck so if AI can help in this area that would be very beneficial.
  Generative AI.
- tracking: here ML is already used in the subsystems. New development needed for future faster detectors. Transformers, foundational methods.
- Hardware data reduction using AI: event trigger on FPGA with neural net (pp only, Pb-Pb no online trigger)

# Al next years – midterm (2-4 years)

• 3.3) What are the expected future computing resource requirements (for training / inference)?

No clear picture at the moment

Challenge identified for tracking: parallization on of the GPU for full event tracking. Especially in Pb-Pb it is a very high density track environment.

# Al next years – midterm (2-4 years)

What is the involvement of Nikhef scientists in ML/Al deployment R&D for next years?

- 4.1) What is the ambition of your Nikhef research program for Al/ML use and deployment R&D? Be part of the new developments on the data analysis and tracking side.
- 4.1) Are there clear leading institutes/consortia in the international field in these R&D efforts? It is scattered over many institutes worldwide
- 4.3) How do Nikhef efforts compare to these in a) expertise, b) person-power, c) infrastructure?
- a) Expertise: we lack computer scientists and could profit from more collaboration with mathematicians and AI experts.
- b) Person-power: see a) + PhDs
- c) Up to now Nikhef cluster was enough. Expect higher need of resources in the future.
- 4.4) Who are your partners nationally and internationally in your efforts & ambitions? Changes per project, especially on the data analysis side.
- 4.5) What expertise, person-power, infrastructure are you missing to compete effectively and/or realize your ambitions? PhDs, postdocs, computing scientist.
- 4.6) What are your expectations and/or plans related to Al-driven coding assistance and/or ChatGPT-style Al (physics) knowledge services? Importance will grow a lot in time.

# Al next years – longterm (5-10 years)

#### C – Long-term future (5-10 years) – future directions

Given the pace of developments in Al/ML, predicting the evolution of its future possibilities on a 5–10y scale is rather speculative.

Instead, here we focus on future application areas where disruptive improvements in AI/ML can make a difference

- Thinking 'Disruptively Big': what research applications are a good target for future AI methods
- Pb-Pb tracking (~10 thousand tracks in one event)
- Detector simulation and design
- 5.1) What are problems 'of interest' that are currently unsolvable (from practical computational point of view) but could be solvable with disruptive AI methods.

In other words, are there paradigm-changing way of thinking about solving physics problems if 'unlimited computational' abilities were to be available?

Clearly there is physics in tails of distributions (rare processes and anomalies). A combination of unlimited amount of data and computing will find them. Difficult to speculate.

#### Other

6.1) Is there any other information regarding the use and potential of ML/AI in your research area that is relevant to be discussed in the task force?

ALICE has a statistics and machine learning topical group where we try to steer the various efforts.