

https://eic.ai/

C. Fanelli, T. Horn

AI4EIC Activities

Summer 2024 Joint EICUG/ePIC Collaboration Meeting

<u>Outline</u>

- AI4EIC paper based on 2022 workshop
- Workshop 2023
 - Proceedings
- Hackathon
 - Paper
- Meetings
 - EIC summarization agent
 - Repository, A Web-Application, Sub-working group
 - Other Topical seminars
- Next Events
 - Streaming Readout Workshop with AI4EIC Collaboration (Tokyo, Dec 2024)
 - Organizing 2025 workshop

<u>Artificial Intelligence</u> <u>for the Electron Ion Collider (AI4EIC)</u>

- What is AI4EIC?
 - Community Paper published in 2024 on Computing and Software for big Science
- Areas:
 - Design of EIC
 - Intersection between Theory and Experiment
 - Reconstruction and PID
 - Infrastructure and Frontiers
 - Streaming Readout
 - Community Efforts (Tutorials, Hackathons and Outreach in general)

Computing and Software for Big Science (2024) 8:5 https://doi.org/10.1007/s41781-024-00113-4

REVIEW



Artificial Intelligence for the Electron Ion Collider (AI4EIC)

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Abstract

The Electron-Ion Collider (EIC), a state-of-the-art facility for studying the strong force, is expected to begin commissioning its first experiments in 2028. This is an opportune time for artificial intelligence (AI) to be included from the start at this facility and in all phases that lead up to the experiments. The second annual workshop organized by the AI4EIC working group, which recently took place, centered on exploring all current and prospective application areas of AI for the EIC. This workshop is not only beneficial for the EIC, but also provides valuable insights for the newly established ePIC collaboration at EIC. This paper summarizes the different activities and R&D projects covered across the sessions of the workshop and provides an overview of the goals, approaches and strategies regarding AI/ML in the EIC community, as well as cutting-edge techniques currently studied in other experiments.

 $\textbf{Keywords} \ \ Artificial \ Intelligence \cdot Deep \ learning \cdot EIC \cdot ePIC \cdot Machine \ learning \cdot QCD \cdot Physics$



AI4EIC Workshop Dec 2023, CUA

- More than 40 contributors, great talks! Thanks a lot to all the speakers! Sessions:
 - AI/ML for ePIC and Beyond
 - Calibration, Monitoring, and Experimental Control in Streaming Environments
 - AI/ML for Accelerators
 - AI/ML for Data Analysis and Theory
 - \circ \quad Foundation Models and Trends in Data Science
 - AI/ML in Production, Distributed ML

Tutorials: Continual Learning, Reinforcement Learning

- ~150 registered participants. Average attendance of 50+, with 30+ in person in the first 2 days and in the morning session
- Thanks also to the advisory committee, conveners and speakers. Many talks presented novel methodologies and were extremely engaging!



<u>Some key points</u>

- Important opportunities for AI in the new EIC (AI/ML for accelerator applications, new capabilities offered by Foundation Models, Language Models, etc.),
- In the discussions identified the need to have common requirements for data feature extraction, testing Benchmarks
 - This could be a session in the next workshop
 - As well as on Uncertainty Quantification
- There are many interesting projects currently supported by DOE. Presence of DOE PMs during AI4EIC.
- During the workshop, participants from universities, national labs, and industry: diverse community strongly interested in AI for the EIC science
- There is a large span of technical areas and AI is a common foundation for it

<u>https://eic.ai</u>



- There is interest in organizing the next AI4EIC event in Europe (targeting spring/summer 2025). This would be the first time outside the US
- It has been highlighted the uniqueness of EIC, as it is likely the only new collider in the US for many decades
- Many ideas have been proposed in the second AI4EIC workshop at W&M in 2022. Since then, we now have DOE-funded projects on AI/ML for EIC and NP in general!
- Now we are at the stage were we review/look at all these efforts together and start identifying commonalities and where the different projects can benefit from each other and enhance each other. Al4EIC is of course the important forum for that too.
- Next workshop might further explore synergies and work towards quantifying common requirements/needs — AI4EIC brings diverse backgrounds together, fostering new ideas and opportunities



Proceedings of 2nd AI4EIC Workshops

- AI4EIC published a total of 13 proceedings this year
 - Performance optimization for a scintillating glass electromagnetic calorimeter at the EIC, J. Crafts et al 2024 JINST 19 C05049
 - Real-time charged track reconstruction for CLAS12, Gagik Gavalian (on behalf of the CLAS12 Collaboration) 2024 JINST 19 C05050
 - Object condensation for track building in a backward electron tagger at the EIC, S. Gardner et al 2024 JINST 19 C05052
 - Photon classification with Gradient Boosted Trees at CLAS12 .G. Matousek and A. Vossen 2024 JINST 19 C06006
 - Normalizing flows for domain adaptation when identifying A hyperon events, R. Kelleher and A. Vossen 2024 JINST 19 C06020
 - Al-assisted detector design for the EIC (AID(2)E), M. Diefenthaler et al (on behalf of the AID2E Collaboration) 2024 JINST 19 C07001
 - Towards a RAG-based summarization for the Electron Ion Collider, K. Suresh et al 2024 JINST 19 C07006
 - Bayesian Neural Network Variational Autoencoder Inverse Mapper (BNN-VAIM) and its Application in Compton Form Factors Extraction (accepted for publication), Y. Li et al (on behalf of the EXCLAIM Collaboration)
 - Beam Condition Forecasting with Non-destructive Measurements at FACET-II (accepted for publication), M. Kilpatrick et al.
 - Particle identification with machine learning from incomplete data in the ALICE experiment (accepted for publication), M. Karwowska et al. (on behalf of the ALICE Collaboration)
 - ML-based Calibration and Control of the GlueX Central Drift Chamber (accepted for publication), T. Britton et al.
 - Hydra: Computer Vision for Data Quality Monitoring (accepted for publication), T. Jeske et al.
 - Physics Event Classification Using Large Language Models (accepted for publication), C. Fanelli et al.



Artificial Intelligence for the Electron-Ion Collider November 28 - December 1, 2023

https://eic.ai/ai-ml-references

2022 Hackathon: CHEP Proceeding published

- Already presented in the past EICUG Meeting
- News:
 - Talk on this experience accepted at CHEP23 (Collaboration, Reinterpretation, Outreach and Education)





https://doi.org/10.1051/epjconf/202429508004

2023 Hackathon: Problem

The LLM problem: Participants are tasked with developing a machine learning (ML) model for a classification problem of experimental physics using only an LLM (ChatGPT) interface. The scope of the hackathon is to evaluate the following.

- 1. *LLM for Code Assist*: Creating the scripts necessary to build a machine learning model for binary classification with limited dataset information by using a Language Model (LLM) and making use of its responses.
- 2. *Few-Shot Prompting*: Constructing the best-performing ML model for binary classification task while minimizing the number of total number of prompts used.
 - Simulated data from GlueX/Hall D
 - Photon/neutron identification in the barrel calorimeter (BCAL)
 - Goal is increase distinguishing power, based on shower profile features
 - Problem 1 Full phase space coverage. High degree of separability.
 - Problem 2 Reduced phase space coverage. Lower degree of separability.





https://orxiv.org/obs/2404.05752 (accepted on JINST) - Physics Event Classification Using Large Language Models

<u>2023 Hackathon: Rules</u>

- Participants could only use the provided custom Chat interface built for this hackathon to interact with ChatGPT3.5. This interface served as the primary platform for participants to formulate queries and receive responses from ChatGPT, allowing seamless interaction with LLM throughout the hackathon.
- Furthermore, participants did not have direct access to the datasets; this restricted participants to train the network elsewhere other than the provided infrastructure and could assess submissions on equal footings.
- Participants did not have access to any editors or could edit the code snippets provided by ChatGPT3.5. Participants were even forced to use ChatGPT to install libraries to run code snippets.
- Finally, to minimize the total number of prompts needed to build the model, all chat interactions were broken down into sessions. Each chat session had a fixed conversational history beyond which the chat session would restart.
- It has been shown that "in-context learning" improves LLM performance [2]. To facilitate this feature, participants were provided with the option to set the 'session context' at the start of each chat session.

2023 Hackathon: Infrastructure

Compute resources:

[Supported by Dept. Data Science and HPC Research Computing at W&M]

- Users were instructed to form teams of up to four participants, in which each team member received their own AWS g5.2xlarge instance with a single Nvidia A10G GPU, 8 cores, 32 GB of RAM and 450 GB of disk
- The user interface was built using the <u>Streamlit</u> platform, specifically built for LLM interfaces. The application was hosted on an AWS c5.24xlarge, where users could access the website using the provided URL



<u>2023 Hackathon: Outcome</u>

Results: Participants Exceeding Expectations The participants and their AI-assisted coding strategies greatly exceeded our expectations in the second problem. Internal tests prior to the hackathon indicated an expected accuracy of around 92%, under the same constraints as the participants, but with prior knowledge of the data set. We requested ChatGPT to provide us with a syntactically correct program, deploying an under-sampling technique to combat imbalanced data, a basic XGBoost [9] decision tree, and a performance analysis as a function of decision boundary placement in the validation set to find the optimal threshold of the model. Remarkably, all teams and participants managed to greatly exceed this score with unique solutions. In fact, all teams submitted scores approaching \geq 99% and are within statistical error. The final decision came down to the combination of the minimum number of prompts to obtain their result and the time submitted in which the "Jets' team emerged victorious. Their strategy involved a CatBoostClassifier [10] coupled with a hyperparameter optimization technique, all of which were directly accessed via concise commands to ChatGPT.

AI4EIC Hackathon 2023

Welcome to the AI4EIC Hackathon 2023. Navigate to the different pages of the hackathon.



- The hackathon included educational outreach for Nuclear and Particle Physics researchers, scientists, and practitioners, raising awareness of LLM capabilities.
- LLM tools like ChatGPT are often key contributors to completing ML tasks, providing detailed code explanations and increasing productivity.
- Saved metadata amounted to a total of 752 prompts between 19 unique users during the 8-hour period of the hackathon and will be subject to study

<u> 2023 Hackathon: Survey</u>

1 (no/min) to 5 (yes/max) Survey: 5 Total hackathon participants: 20+

1. Have you used ChatGPT before?



2. How relevant and helpful is ChatGPT for your everyday work?



3. If you haven't used ChatGPT as a coding assistant in the past, how likely are you to use it after your Hackathon experience?



4. What is your main takeaway from this hackathon?

ChatGPT can be a very powerful tool for coding. Brief but precise prompts tended to produce the best results. I am shocked that ChatGPT did such a good job at picking ML algorithms for classification problems without a-priori knowledge of the data those algorithms would be using.

ChatGPT generates valid programs with much higher rate than I expected

Inspiration

Having never used ChatGPT before, honestly my biggest takeaway was just learning how to use ChatGPT to get reference code snippets!

How much chatGPT can do when it comes to suggesting ideas for how to solve problems with AI and how to implement that solution. Since the hackathon I have used chatGPT to help in my own work and will continue to do so.

<u>2023 Hackathon: Survey</u>

Any overall feedback for the event?

Thanks again to organizers. Please keep arranging these hackathons at conferences.

Was a great event! Many thanks to the organizers.

will be happy to host the same hackaton in my institute soon

This was great!! I had a blast and learned a lot!

If possible I would like access to the training data sets and test data set with answers - my supervisor teaches machine learning to undergraduate students and was very interest in taking a look at this and potentially setting something similar for his students.



1 (no/min) to 5 (yes/max) Survey participants: 7 Total hackathon participants: 20+

Satisfaction for the built infrastructure

Topical Meeting: RAG-based Summarization



Why a summarization tool?

- Ease of retrieving up to date information on topics.
- Extremely useful for new collaborators and especially students.
- Large Scale Experiments ∝ Size of document database.



EICUG > 1400 physicists, 240 institutions and 38 countries....

Why LLM based summarization?

- Increased contextual understanding posed by LLM
- Enhanced information retrieval and faster decision making.

The requirements?

- Should be free of hallucinations.
- Should unfold all contexts using short prompts
- Provide up to date information without "being" constantly trained

<u>Also an Ongoing HEP Effort</u>

chATLAS

An Al Assistant for the ATLAS Collaboration

DANIEL MURNANE, GABRIEL FACINI, RUNZE LI & CARY RANDAZZO

AI4EIC WORKSHOP NOVEMBER 30, 2023



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The ATLAS paper publication process involves the ATLAS Publication Committee receiving papers intended to be published as scientific notes. The Publication Committee will provide ATLAS referees to evaluate each paper, judge its suitability for publication, and interact with the authors regarding possible revisions. The Publication Committee will then make a final recommendation to the spokeperson. Journals publishing

What is the ATLAS paper publication process?

OPEN QUESTIONS & CONCLUSION

- How to avoid hallucinations? Probably "GPT-5 / Q* / AGI" will make this hurdle irrelevant
- How to best "censor" politically incorrect responses (e.g. which analysis team is the best?)
- How to measure the quality of responses LangSmith Al-assisted evaluators?
- What is the best dataset to gather for fine-tuning?



 How to anonymize email threads and discussion forums?

We are having a lot of fun building this thing from scratch, but if there was an open-source scientific community framework for AI Assistants, it would be even more fun!

Talk at AI4EIC-2023 An AI Assistant for the ATLAS Collaboration ation or Working

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The ongoing AI4EIC Project:

Retrieval Augmented Generation using LLM pipeline

Ingestion

- Load data (semantic) both structured and unstructured from sources
- Split data in small repetitive chunks text corpus
- Embed these chunks into a vector space using an embedding model
- Store these vectors in a database for retrieval later.

Inference

- Given a prompt, compute similarity index. Select the most closest vectors
- Choose a response template. Embed the vectors along with input prompt and feed into LLM
- Evaluate the response
 - Model fine-tuning
 - Build metrics for context tuning
- Multi Modal Output





The Generic Workflow of building Traditional RAG



<u>Talk at AI4EIC-2023</u> A Large Language Model-based Assistant for the Electron Ion Collder

The ongoing AI4EIC Project:

RAG application and evaluation

Repository: <u>https://github.com/ai4eic/EIC-RAG-Project</u> Web-Application: <u>https://rags4eic-ai4eic.streamlit.app/</u>

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PINECONE Y	- The study of 1/4 palavivation is large DT comi inclusive doon instantic controving /	SIDIC) at the Electron Ion Collider (EIC) can belo	in gotting
trieval Metric	 The study of J/ψ poralization marge-PT semi-inclusive deep-inelastic scattering (information on the J/ψ formation mechanism, both at large z (high- and low-energy 	gy set-ups) and as a function of PT (at large ener	rgy)[1^].
Cosine similarity 🗸	 Future measurements of transversely polarized Λ/⁻Λ in SIDIS will potentially allow different scenarios, contributing to the understanding of the J/ψ polarization in SII 	v us to gain further insights and to distinguish bo DIS at large PT[2^].	etween
х к 10	I hope this helps to answer your question.		
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	 http://arxiv.org/abs/2301.11987v1 		
Select Vector DB	View the trace 🛠		
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Check out the full trace of the pipeline in langsmith

Classic Metrics

Metric Name	Definition	Score
Output Renderer Frequency	Frequency of correctly rendered	78.0% ± 5.8%
	output response in the markdown format	
Claim Recognition Rate	$CRR = \frac{ \text{Number of answered claims} }{ \text{Total number of claims in question} }$	$96.4\% \pm 3.4\%$
Claim Accuracy Rate	$CAR = \frac{ Number of correctly answered claims for a question }{Total number of recognized claims in question}$	$88.9\% \pm 8.3\%$
Source Citation Frequency	$SCF = \frac{ Number of time question's source cited }{ Total queries }$	$85.3\% \pm 5.0\%$
Hallucination Frequency	$HF = \frac{ Number of hallucinations }{Total queries}$	2% ± 2%

RAGAS – LLM based evaluation

Metric Name	Definition	Score	
Faithfulness	Fraction of correctly rendered	87.4% ± 5.5%	
	output response in the markdown format		
Context Relevenacy	Relevancy of the retrieved context	61 494 + 4 294	
	to the question and generated answer	$01.4\% \pm 4.5\%$	
Context Entity Recall	CER = claims in context∩claims in ground truth claims in ground truth	$98.7\% \pm 1.2\%$	
Answer Relevance	Measures relevancy of the generated answer	77 204 + 2 204	
	to the retrieved context and the question	11.2 % ± 2.3 %	
Answer Correctness	Measures correctness of the	72 201 + 2 401	
	generated answer to the idea response	72.3% ± 2.4%	

Talk at AI4EIC-2023

A Large Language Model-based Assistant for the Electron Ion Collder

Next Events: Streaming Readout & AI4EIC

Streaming Readout Workshop + AI4EIC - Tokyo, December 2 - 4, 2024

This meeting brings together DAQ specialist and experimentalist from all over the world, to discuss the learning experience from existing streaming DAQ system and collaborate on future Streaming DAQ system in particularly the EIC.

This SRO XII edition will be held in Tokyo, Japan, from 12/2 to 12/4. The University of Tokyo will host the workshop.

At this time, we will have a joint session between SRO and Al4EIC to discuss the development and implemenation of Al/ML based technologies in the streaming readout and DAQ.







https://indico.bnl.gov/e/SRO-XII

<u>Next Workshop (abroad) 2025</u>

- There is growing interest in organizing the next AI4EIC workshop abroad, with discussions already underway with international institutions.
- This reflects our commitment to fostering global collaboration and sharing cutting-edge developments in AI and EIC research with a broader audience.
- We believe that holding the workshop in a vibrant international venue will not only enhance the diversity of perspectives but also provide unique opportunities for networking and partnership building.
- The venue details are currently being finalized, and we look forward to announcing the location soon. Stay tuned for updates on this exciting development.



https://www.eicug.org/content/map.html

<u>Conclusions</u>

DE-FOA-0002875

NP held a one-day roundtable on "Machine Learning and Artificial Intelligence for NP Accelerator Facilities" on January 30, 2020, with focus on discussing opportunities in AI/ML for improving efficiencies of accelerator operations of NP facilities. Additional information on the workshop and copies of presentations can be found at: https://science.osti.gov/np/Research/ai. An NP community workshop at TJNAF in March of 2020 considered priority research opportunities in AI/ML. Also, an NP community computational science workshop in September 2022 was held to identify future directions in computational nuclear physics by a combination of high-performance computing combined with AI/ML and experimental data. And in October of 2022, an AI for EIC workshop was held to address how AI might contribute to advance research, design and operation of the future EIC. More information on these workshops and meetings can be found in the Reference section below.

• Active Engagement and Events

- Organized the third successful workshop (+tutorials and hackathon) in December 2023 and planning a joint event with Streaming Readout in December 2024.
- AI4EIC workshops have become a pivotal venue in the NP community, recognized by federal agencies in their Funding Opportunity Announcements.

Successful Hackathon Events

• AI4EIC Hackathons have achieved remarkable success, fostering innovation and collaboration.

• Promoting Al/ML Literacy

- Continued efforts to enhance AI/ML literacy within the EIC community, resulting in:
 - 13 proceedings published this year.
 - 2 hackathons documented in peer-reviewed papers.
 - 1 community paper on Computing and Software for Big Science.

• Topical Meetings and Innovative Projects

- Initiated topical meetings on cutting-edge topics and projects, actively involving the AI4EIC community.
- For more details, see the repository on RAG-based summarization project.
- Other meeting announced soon (topic UQ)

• Future Plans

• Planning a new workshop and hackathon outside of the US, in collaboration with international partners.