# **CSAID AI Jamboree Flash Talks**

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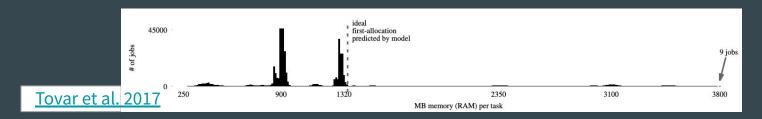
January 30, 2025

#### Smarter Storage - Nick Smith

- Distributed storage is our gold mine: all science insight requires performant, reliable access to petabytes of data
  - Performance: choose right technology for right dataset
    - Smart caching (prior art using deep Q-learning: <u>2208.06437</u>)
  - Reliability: predict and reduce impact of hardware failure
    - All modern storage distributes data across multiple drives/servers/racks such that one loss does not prevent data access. Frequency of failures at scale causes trouble for hash-based data location such as Ceph (meta). Predicting and pre-handling failure may help? Related: <u>disk prediction</u>

# **Optimizing resource requests- K. Herner**

- Often a clear peak with a long tail in batch job resource profiles
  - Initial instinct is to provision for the most demanding jobs. The more you request, the less can run concurrently...
- Often also have an initial setting and then increase on retries
  - What are the optimal initial settings for a given task? Can we determine in a programmatic way? Can we dynamically update job resources before exhaustion?
  - Some literature exists on the topic
- Historical data on previous runs can often guide us lacksquare
  - Use it to so generate (close to) optimal requests ahead of time?
- How fine-grained can we get with resource requests as a function of input data? Pe lacksquare
  - Automatic tuning based on "similar" datasets and/or historical runs? Per input file? Dynamic adjustments in jobs? Many possibilities?
- Can we make a generic tool useful to multiple experiments?

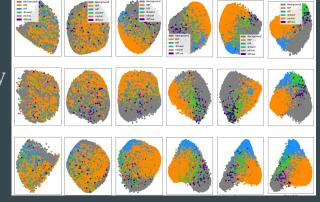


## Making Monitoring Data Accessible to AI - K. Retzke

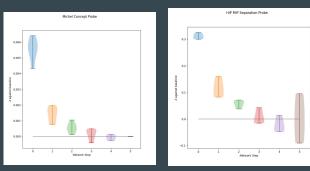
- The Landscape project collects and stores a large volume of data:
  - Batch systems, disk & tape storage, data transfers, system/host metrics, service metrics, traces, logs
  - Metrics in time-series databases Graphite and Prometheus/Mimir
  - Log/event data in semi-structured (JSON) documents in Elasticsearch/OpenSearch
  - More Info: <u>https://landscape.fnal.gov/docs/</u>
- How do we make this data more accessible for AI projects?
  - Online data warehouse/data lake Clickhouse, Iceberg, etc?
  - Offline files/buckets (data swamp?) Parquet, CSV?
- What tools/interfaces should Landscape provide to enable AI-powered research?

# Network Explainability - M. Voetberg & G. Cerati

- Built-in network explainability required to not add uncertainty into analysis of the network
  - Most existing post-hoc methods require either training a method or additional optimization problem
  - Must be better solutions than asking an LLM for reasoning (inherent fraught by non-negligible error bars) or looking at a network latent space (biased by both user interpretation and subset of data used for evaluation and visualization)
- Generic framework for putting together AI methods that can be explained generically (e.g. network blocks) - similar to having saliency maps for CNNs.
- Linear network probes worked well for a classification network with discrete "concepts", but unscalable for different types of networks and problems.
  - How exact to do this? Required to actually look into both internal network components and data structure features.
  - <u>In line with the upcoming FOA</u>
  - Building off previous work with GNNs



Latent Space Clustering study of GNN classifications



"Concept Probes" - decoders measuring how well different combinations of classes are classified at points in the network's inference process

# Dynamic learning systems for storage and network - Lindsey Gray

- Data placement and satisfactory user feedback loop in HEP/Astro data processing systems is an unsolved problem
- Try to use RL and Agents to solve this? i.e. Define **actions** that are the results of **policies** 
  - "User initiates a job J that requires dataset D running at site X"
    - Create virtual network circuit between sites?
      - bandwidth guarantee?
    - Transfer data from sites Y, Z to X ?
      - partial xfer to **X** for better throughput?
      - How long do we keep data at X?
    - Delay executing **D** until bandwidth between **X**,**Y**,**Z** is suitable for xfer or rapid completion?
- Understanding what to do requires a just-in-time global optimization over multiple parameters with constraints
  - Using MDMM (Lagrange Multipliers for NNs), Reinforcement Learning can create a feedback loop that satisfies physical constraints of network / storage
  - Learn policies based on satisfying constraints, user requests, and dataset features
  - Agents can be used as an automated system for creating/submitting requests to lower level tools from high-level user request
  - Agent requests can then be used to close to loop for managing data in a geographic region, subject to the constraints of WAN traffic, job load, storage

## Tape Storage Digital Twin - S. Norberg

- We have a lot of data about how tape is used via multiple experiments, from the steady state usage to the bursty experimental usage
  - $\circ$  ~ With this data I want to create a digital twin to run tests on
  - Dev systems do not include the problems we see in the production systems (complexities of user interactions are not included)
  - We have a virtual tape environment available but it does not simulate experimental access
- If we had a digital twin we could then do testing on a more realistic system
- One way to use the digital twin would be with working on how to place and take data off the tape system(It is more or less a first come first serve system now.)
- There are only so many problems a human can find, having a digital twin test stand for tapes can help to find problems before they happen

# Backup and additional convo topics

## LLM + RAG Ticket Triage?

- System for automatically redirecting tickets/common questions to documentation or correct POC
  - Many tickets can be answered with "Here is the page you're looking for". Why don't we automate that?
  - Free up time of already oversubscribed support staff
- See Gennadiy's talk from this morning for a Proof of Concept
- Use open source model (Ollama, etc) hosted on site, condition with existing documentation sources and codebases

## Smart Heterogeneous Computing Management - Nhan Tran (?)

- Classic question of "How do we know when people need what compute?"
- Predictive management of systems recommend for up or down scaling on certain resources (e.g. HEP Cloud)