



# Data Popularity and Data Certification

*CERN openlab Open Day*

**Yandex**

Andrey Ustyuzhanin

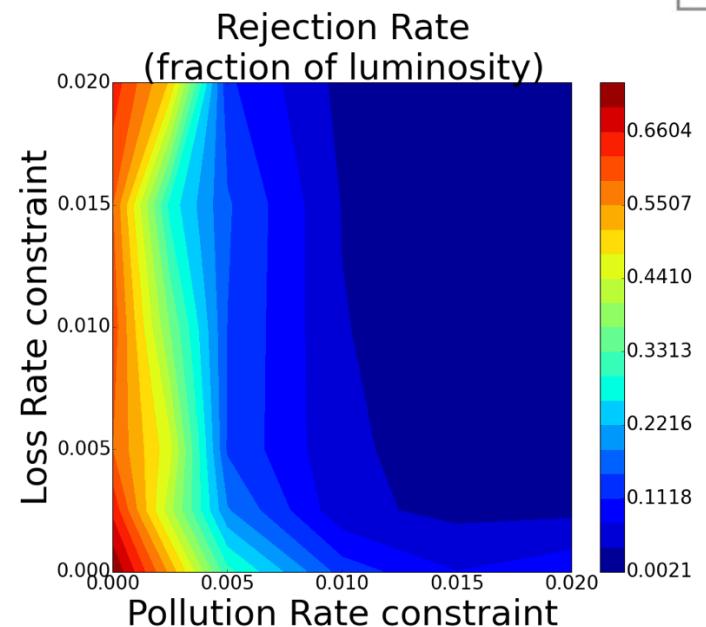
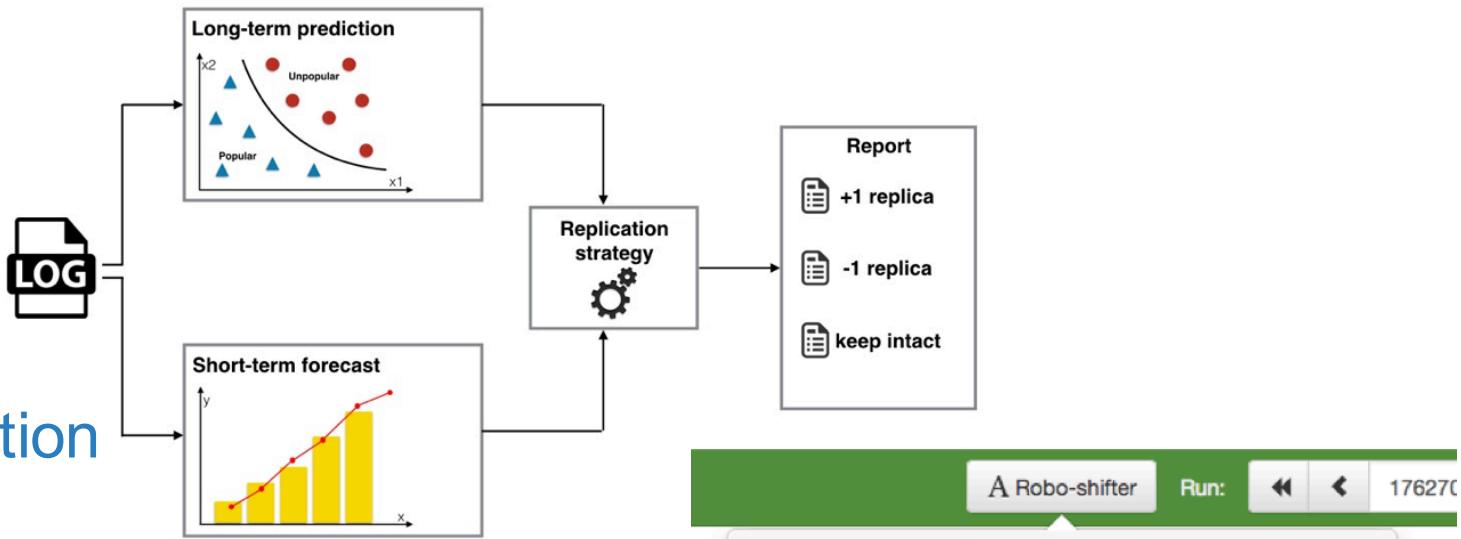
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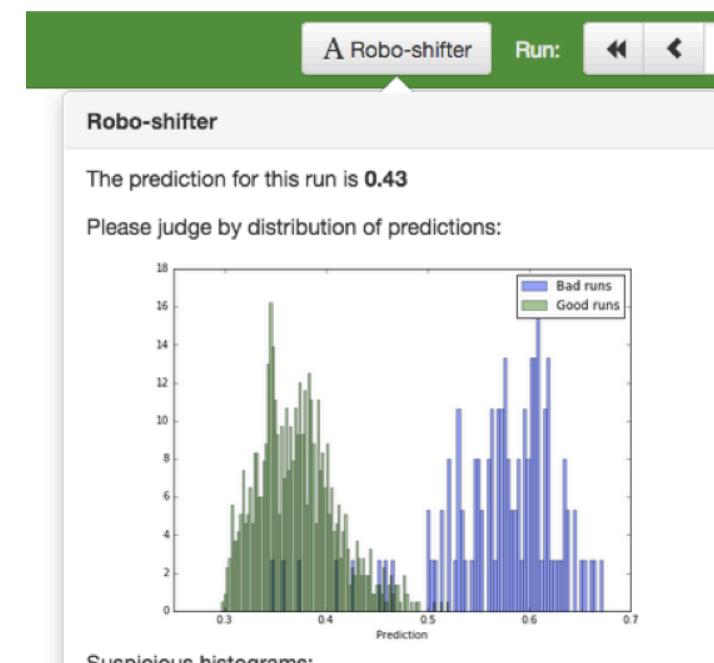
# Projects

## overview

1. LHCb Data Tiering
2. LHCb Data Certification
3. CMS Data Certification



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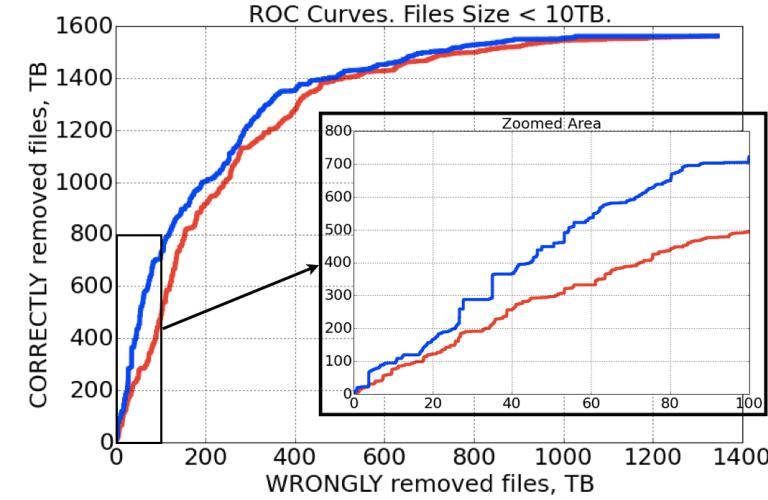
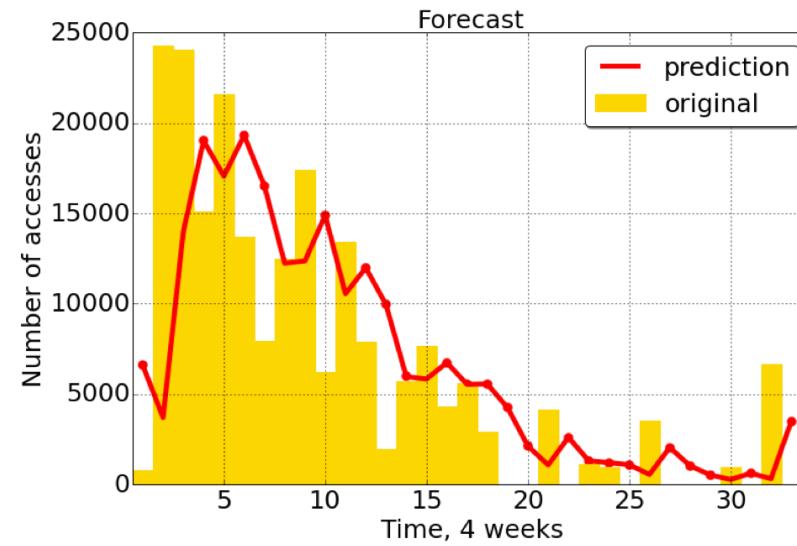
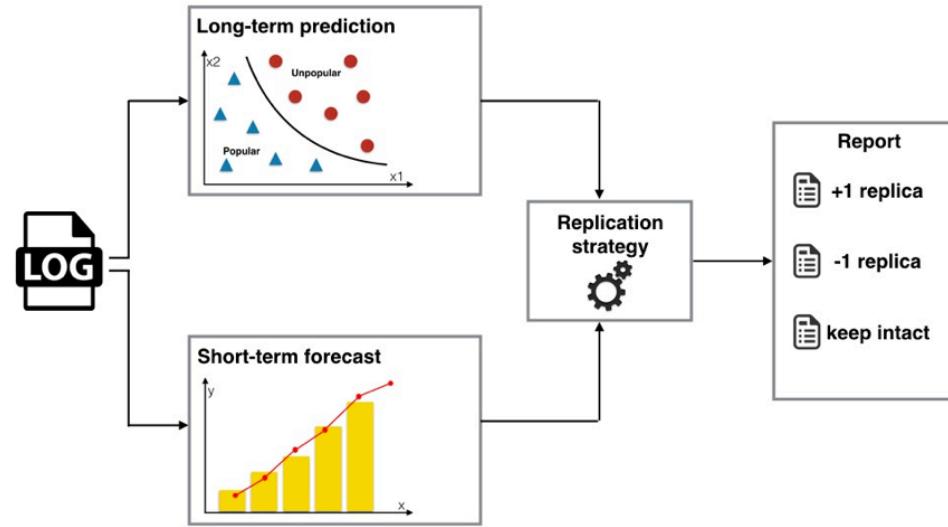


- /OfflineDataQuality/CALO: page 1: Photon and Electrons Reconstruction: histogram Hypo Energy Rec/Calo/Electrons

# LHCb Data Popularity. Context

*Time series prediction*

1. Analyze data usage
2. Predict future usage



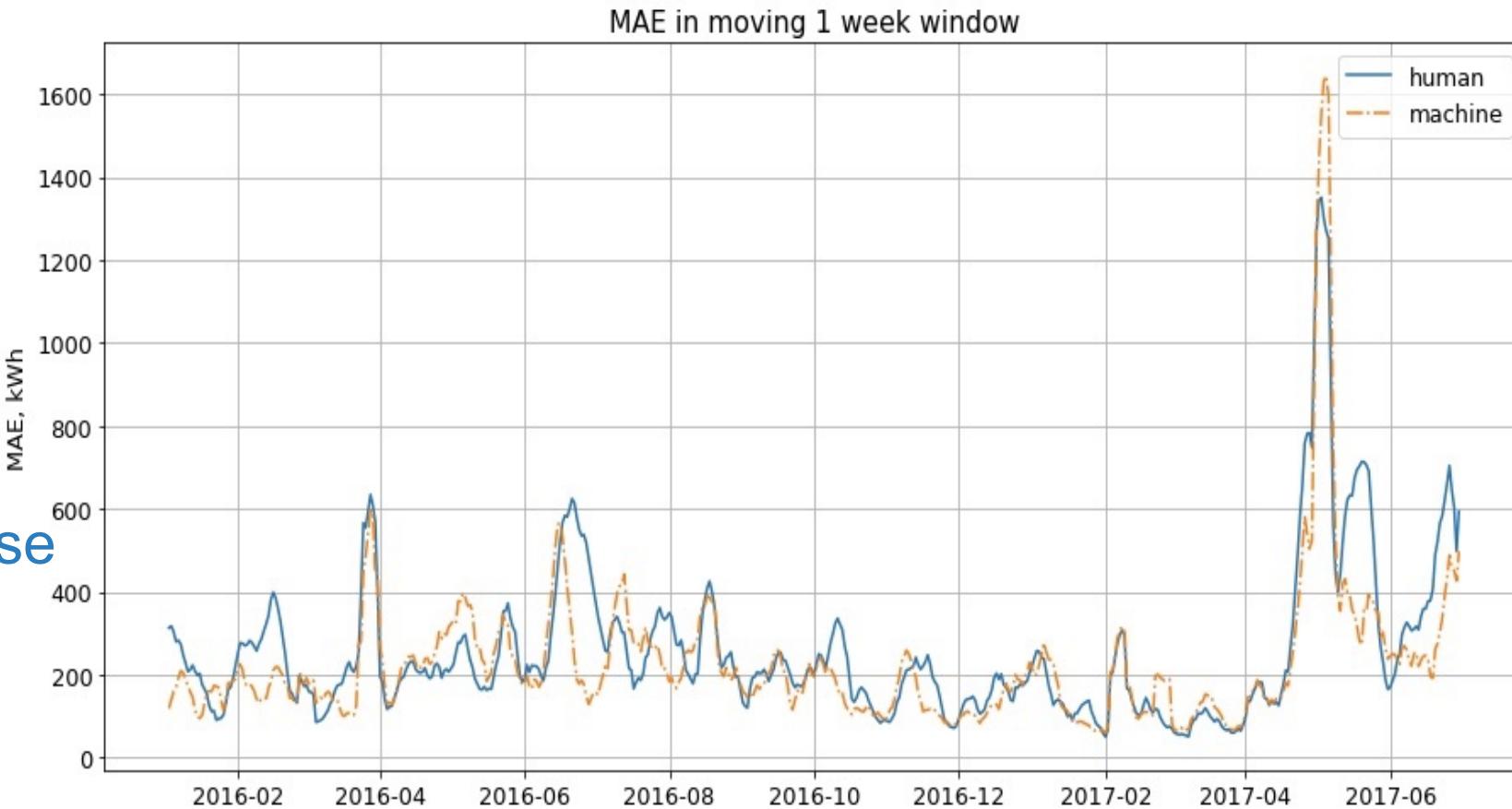
#time-series  
#storage  
#predictive  
#assistive intelligence

# 2017

## *Result*

Apply very similar approach to predict Yandex Data Center energy consumption to reduce electricity cost overhead.

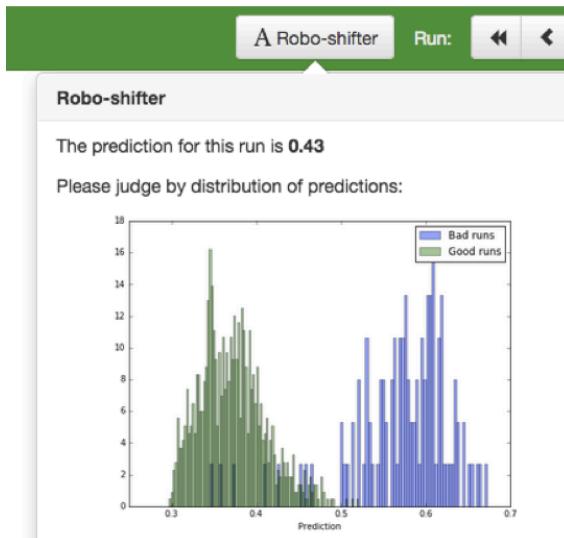
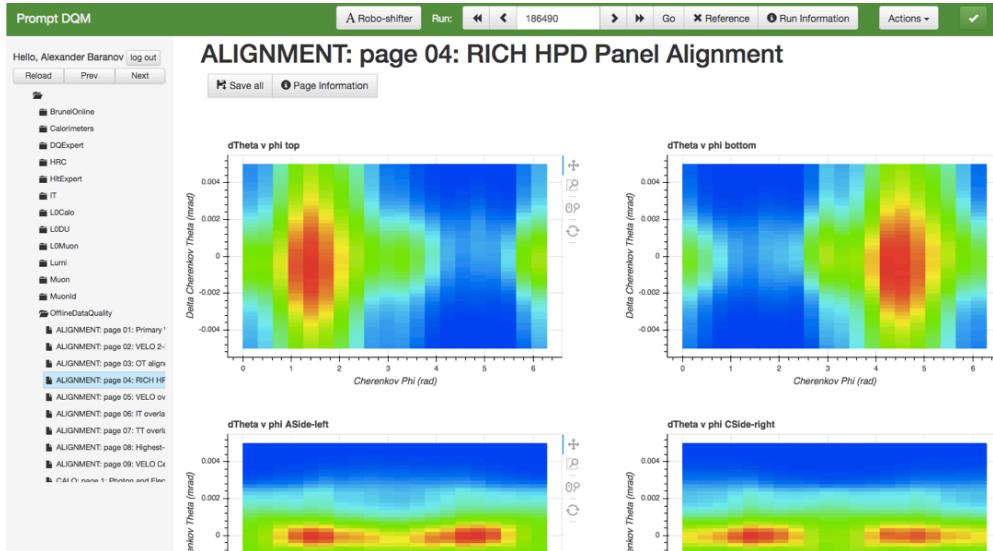
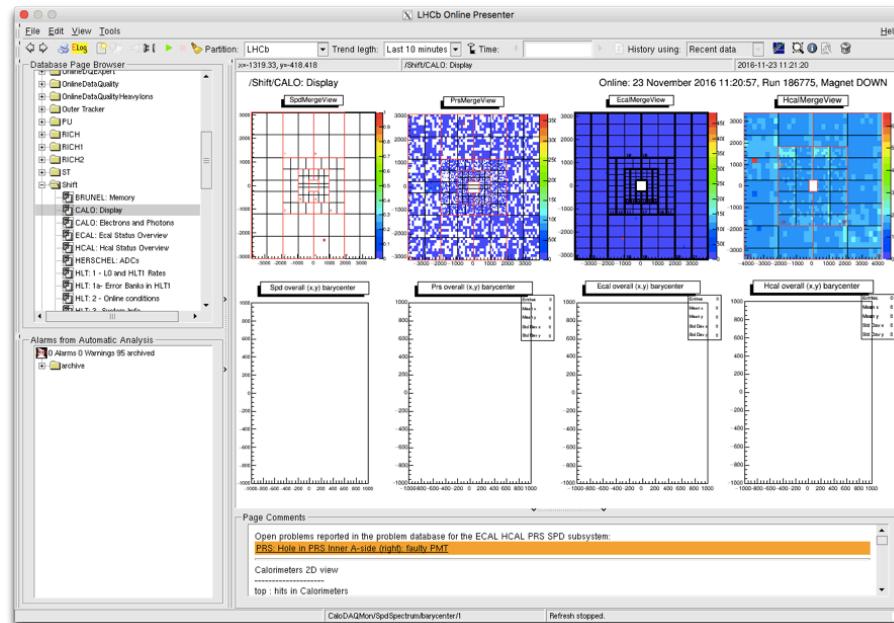
Relative error is not worse than human, and is halved during certain periods.



# LHCb data quality

## Online & Offline Data Quality Monitoring

- Upgrade LHCb monitoring software
- Add predictive capabilities



#monitoring  
#predictive  
#anomaly management  
#assistive intelligence

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# 2017

## Result

- Compare different algorithms
- Decision interpretability
- Class dis-balance mitigation

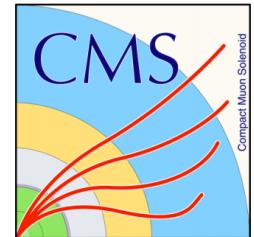
Algorithm	ROC-AUC	Precision	Recall
SVM	0.894	0.895	0.78
Random Forest (simple)	<b>0.899</b>	<b>0.962</b>	<b>0.80</b>
AdaBoost	0.898	0.949	<b>0.80</b>
RandomForest (bins)	0.878	0.913	0.77
RandomForest (fft)	0.881	0.924	0.75

Algorithm	MRR	MAP@1	MAP@5	MAP@10
TreeInterpreter	0.47	0.35	<b>0.22</b>	<b>0.17</b>
Decision Rule Gradient	<b>0.56</b>	0.26	0.12	0.07
AdaBoost	0.54	<b>0.43</b>	0.21	0.12

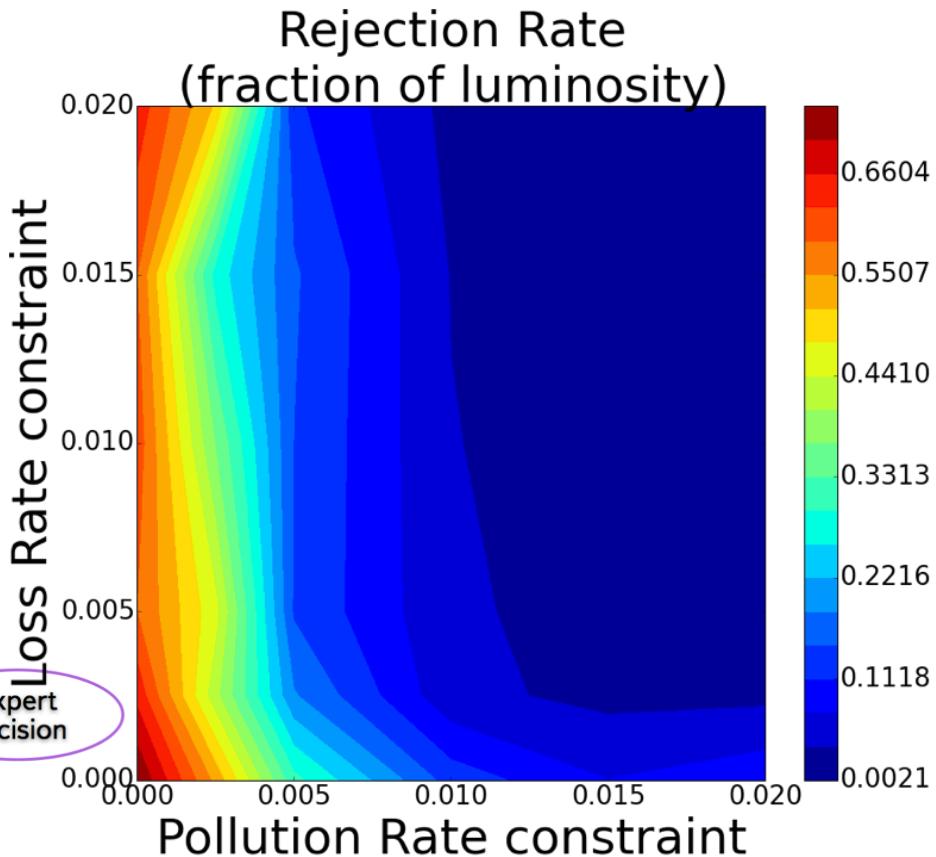
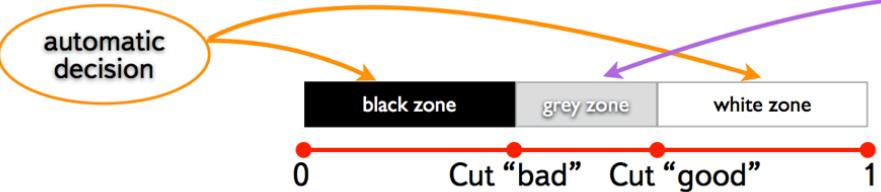


# CMS Data Certification

*Automatically highlight anomalous lumisections*



- Analyze 2010 CERN open data
- Develop algorithm for bad lumisection identification, based on event characteristics



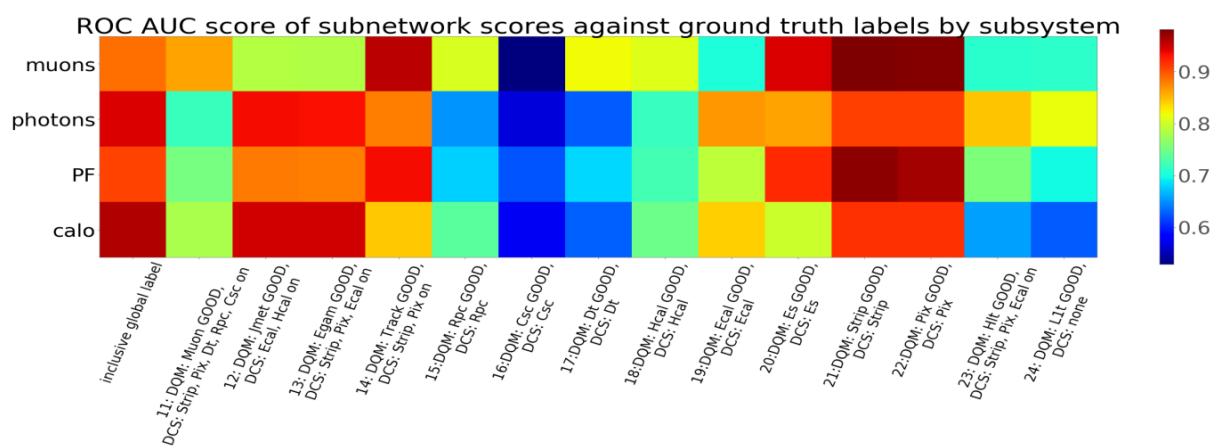
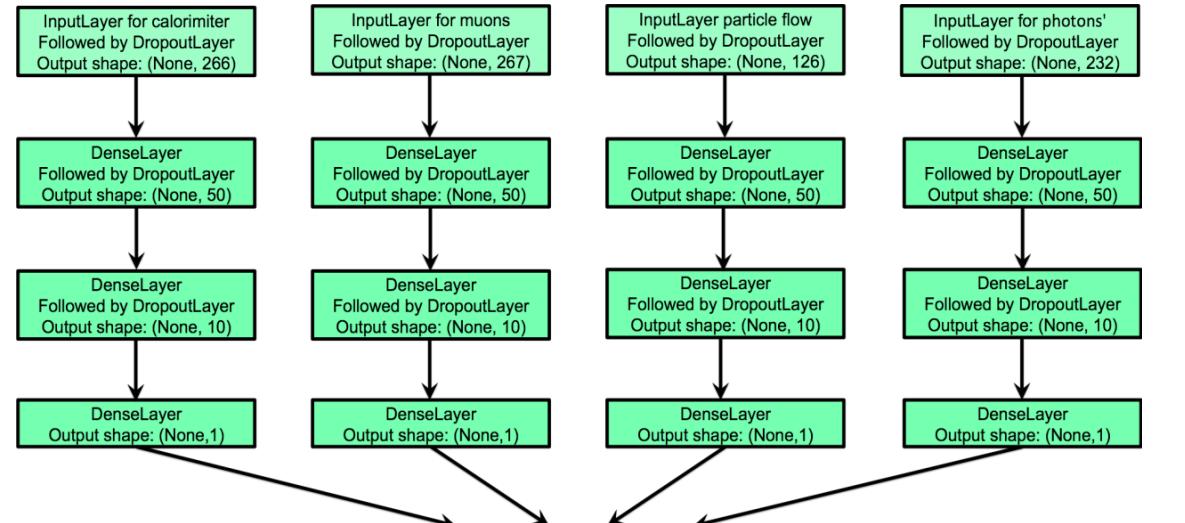
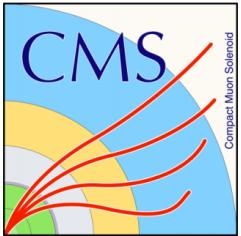
~80% saving on manual work is feasible for  
Pollution Rate at 5% and zero Loss Rate

#monitoring  
#predictive  
#anomaly mgmt  
#assistive int

# 2017

## results

- Developed semi-supervised algorithm for identifying channel anomalies using just general labels.
- Started working on 2016 (much more realistic dataset)



# ML HEP, summer school, invitation

2015 – Saint Petersburg,  
Russia

2016 – Lund, Sweden

2017 – Reading, UK

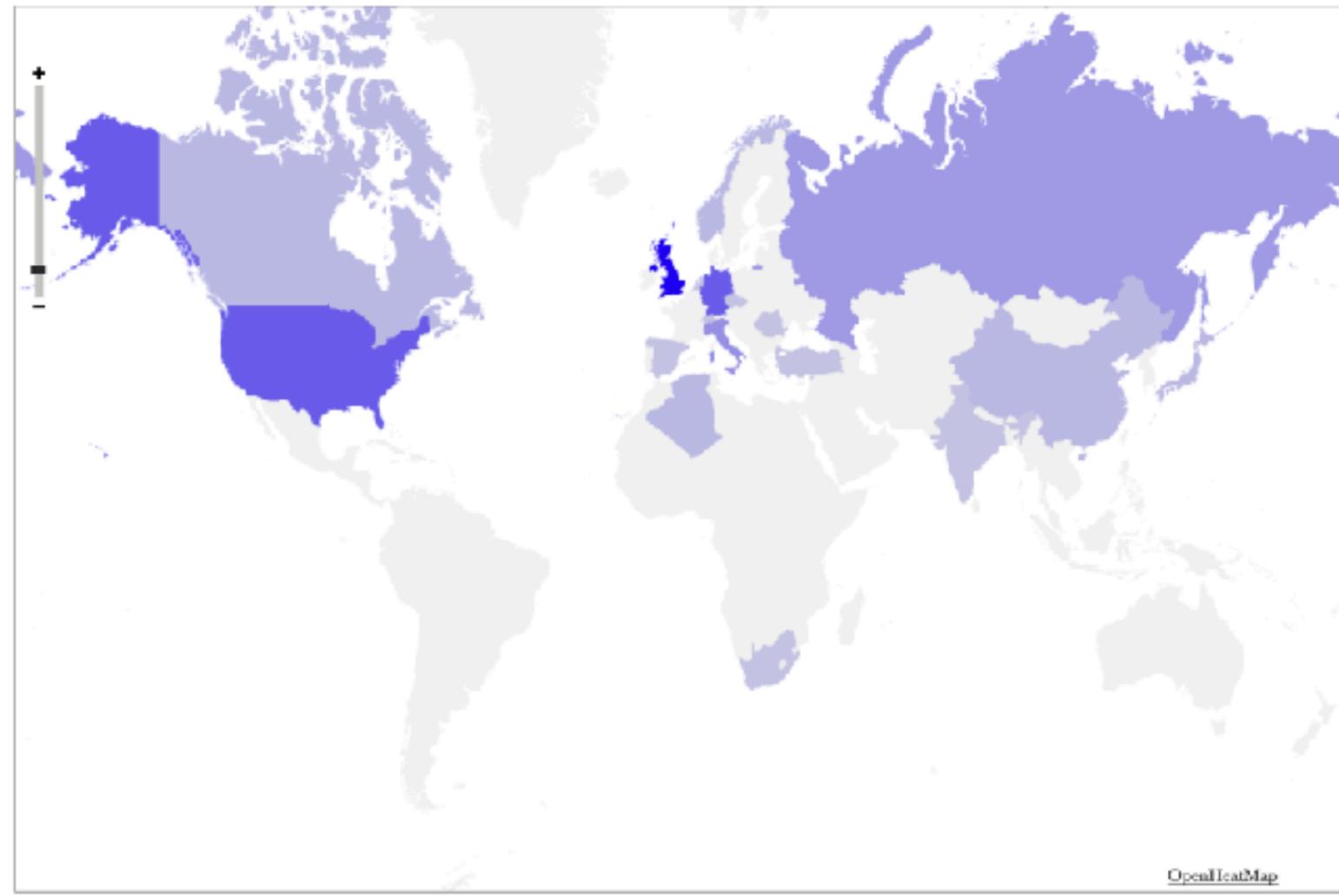
- 60 participants from 18 countries, 47 universities
- ML basics, Deep Learning, GANs, GP
- Invited speakers from academia and industry

Data Challenge

<https://bit.ly/mlhep2017>

2018 – Oxford, UK (TBC)

- **speakers?**
- **sponsors?**





# QUESTIONS?

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