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CHEP 2019 4-8 November 2019, Adelaide, Australia

# Enhancements in Functionality of the Interactive Visual Explorer for ATLAS Computing Metadata

Interactive Visual Explorer (InVEx) is a web application for the exploration of big volumes of multidimensional data.

**ATLAS computing metadata** has become the research ground for this application.

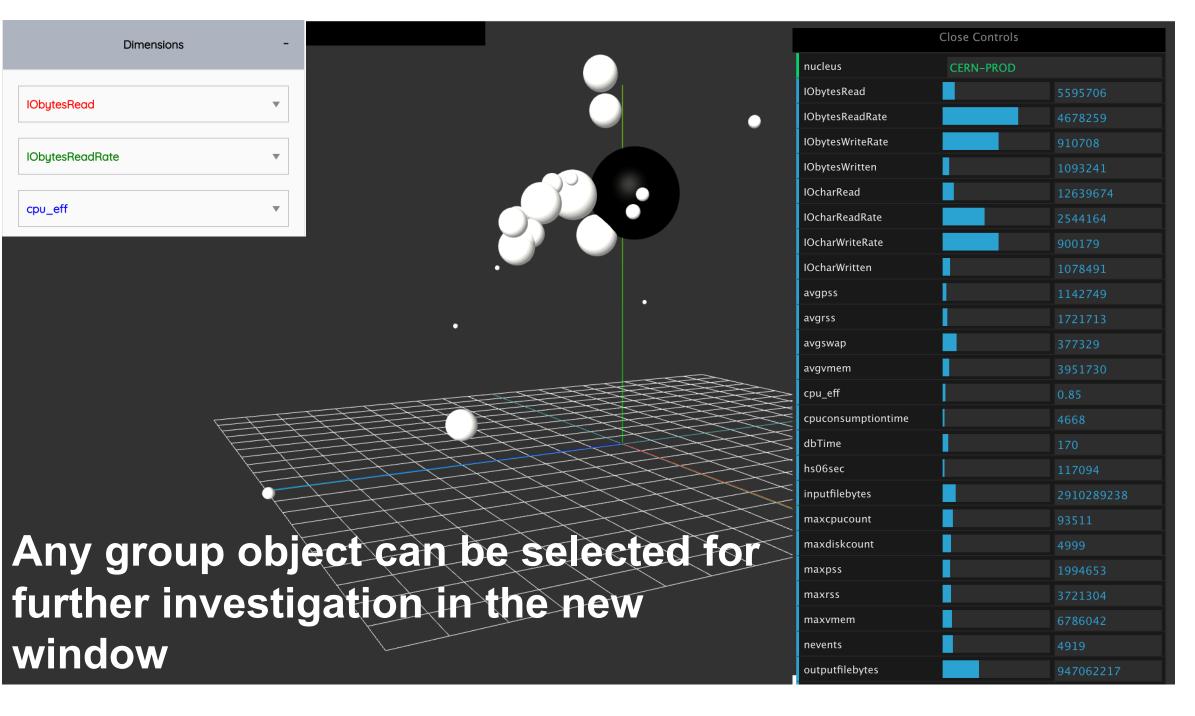
#### **Basic features:**

Machine learning methods for data analysis
 (clusterization algorithms – Kmeans, DBSCAN)

#### 

3D visualization of the grouped data sample (Level-of-Detail Generator)

Figure shows ATLAS BigPanDA jobs metadata for some period of time grouped by nucleus



interactive 3D visualization models of data
 Visualization of the results of clusterization

#### **Enhanced functionality:**

 Dataset Info Panel: data sample features
 representation by statistical measurement types: numerical, ordinal, nominal, range non-categorical
 (string data, that can't be treated as categorical)

#### □ Added new clusterization algorithms:

- MiniBatchKMeans/sklearn
- Hierarchical/slkearn
- K-Prototypes/sklearn

#### □ Implemented the Level-of-Detail Generator,

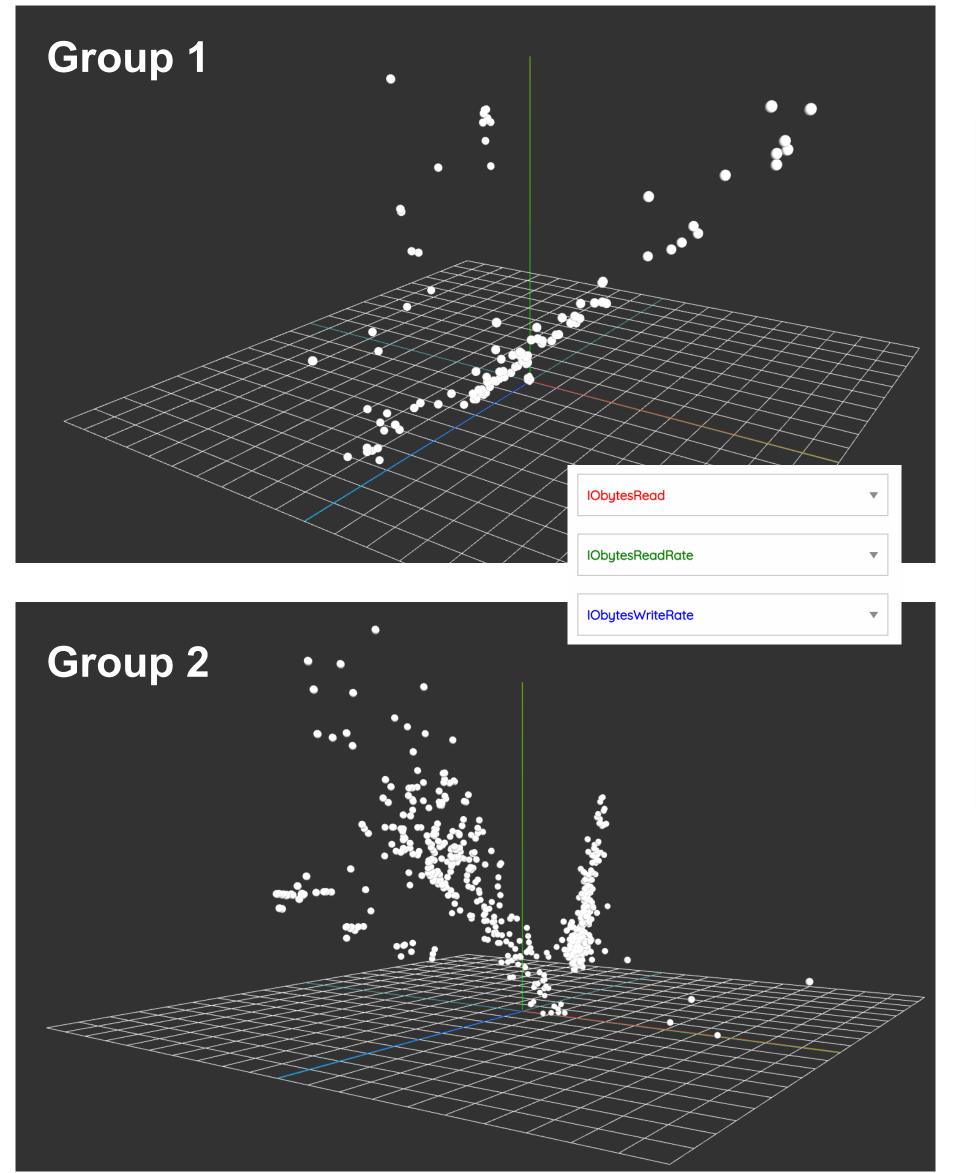
providing grouping of an initial large data sample into clusters/groups to reduce the amount of data presented to the user simultaneously:

- MiniBatchKMeans Clusterization method
- Group by nominal/ordinal parameters

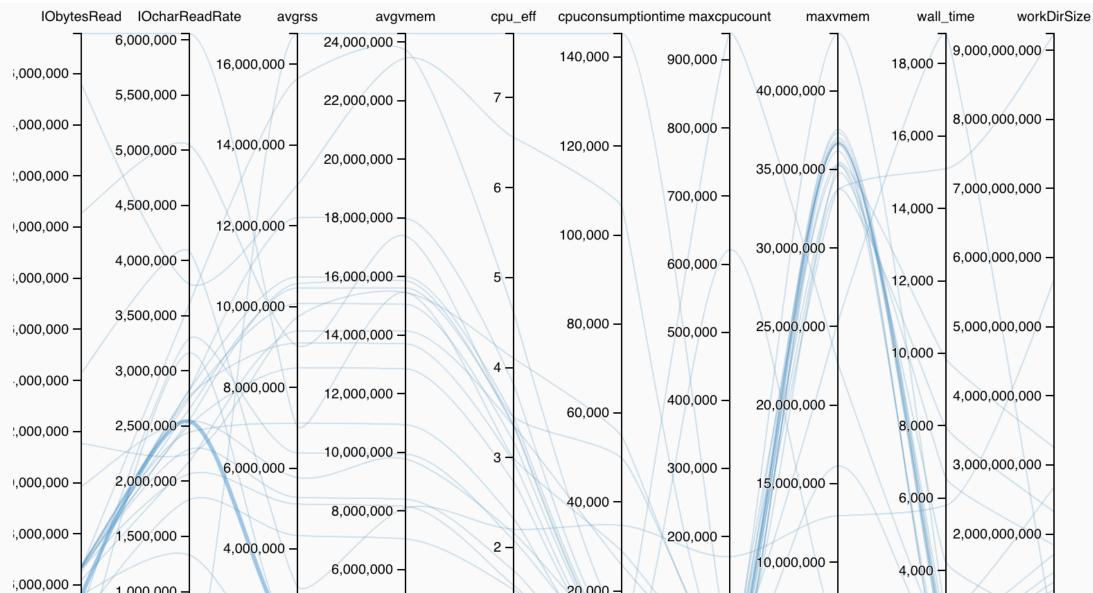
- Group by numerical continuous parameters The LoD method hides the complexity of the initial data, and allows users to use 3D visual scene to select interesting objects/groups and investigate

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Comparative analysis of the selected data groups in different dimensions



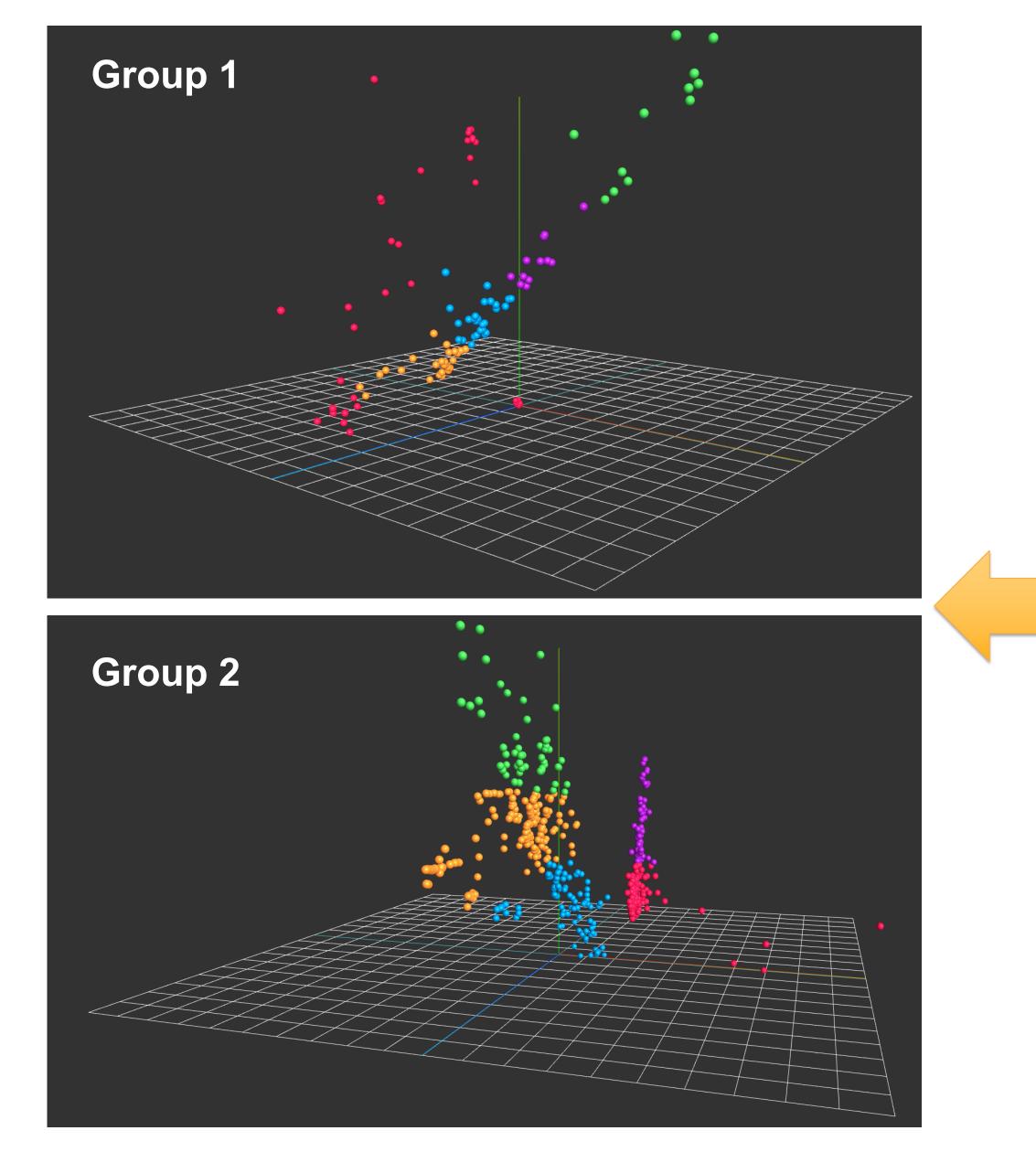
## Parallel Coordinates graph with linked table (exploration of aggregated groups parameters)



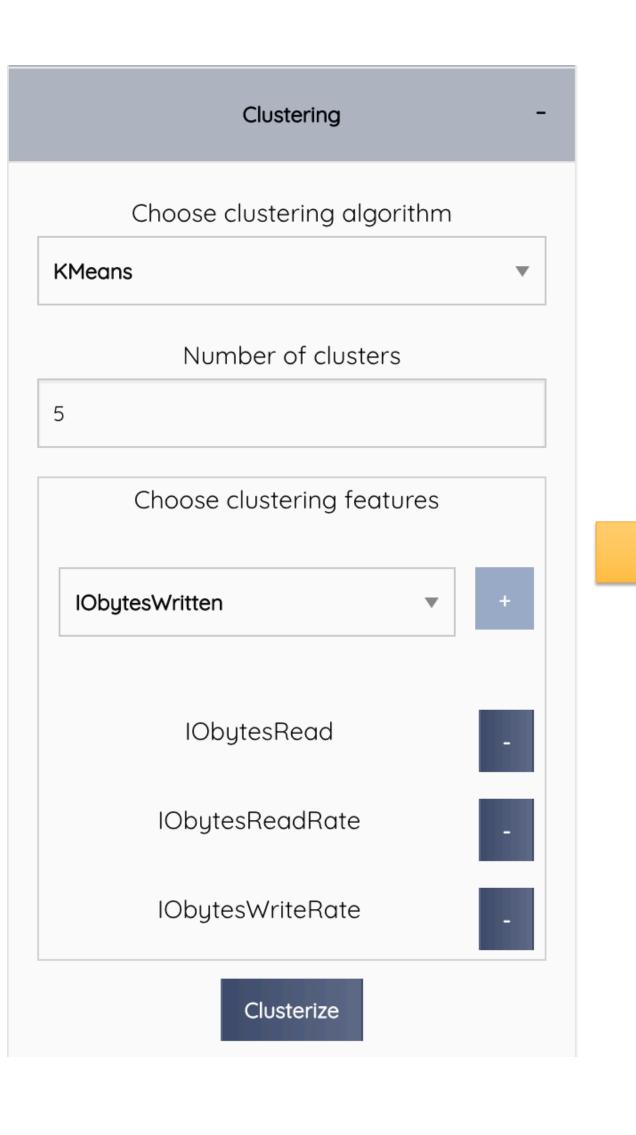
them separately in the new window.

- Storage backend with the ability to store all information about provided operations with data (clusterization, grouping, change of the level of detail) and keep all stages of data derivation sequence.
- Interactive parallel coordinates graph with a linked data table for the exploration of data in all dimensions simultaneously.

Visualization of the clusterization results

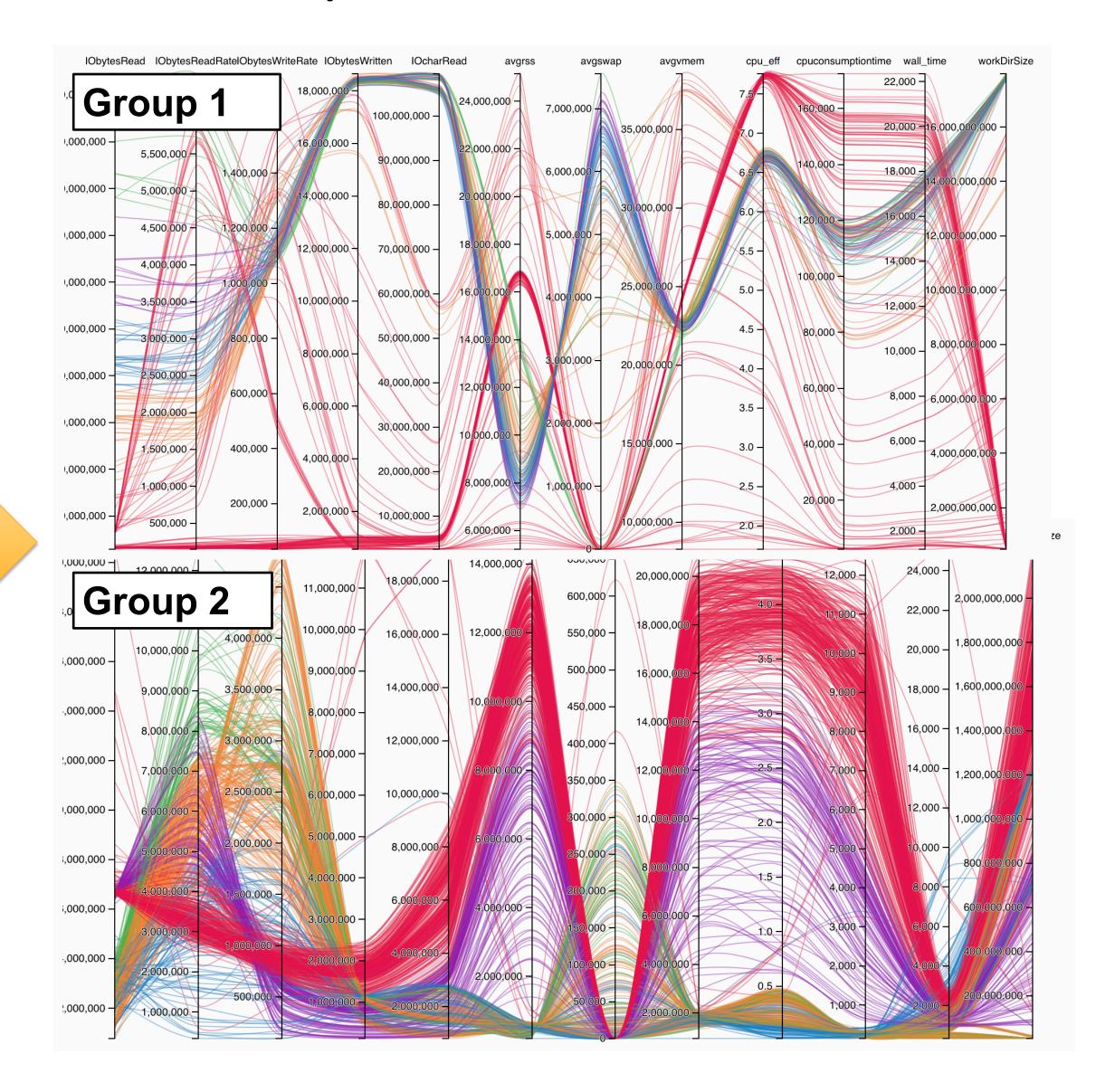


Clusterization with the selected parameters and features



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### Parallel Coordinates allows to explore trends of parameters for each cluster



The project **"Visual analytics framework to monitor workflow management systems behavior in exascale era"** is supported by **RSCF grant Nº18-71-10003 for 2018-2021 years**.



