# Data Scaling for Efficient Processing on HPC Clusters

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# Background

#### **Exponential growth of data**

HPC clusters support a wide array of applications with exponentially growing data in: Bioinformatics analysis; Artificial intelligence/machine learning; Genomics; Next-generation sequence analysis and alignment; Modeling and simulation; Statistical analysis and more.

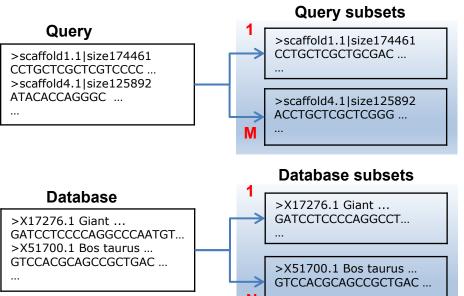
#### **Data scaling**

**However**, applications that do not utilize appropriate scaling techniques have limited ability for taking advantage of the HPC resources and may overwhelm even powerful HPC clusters. Our data scaling techniques overcome the challenges for the application areas.

# **Materials & Methods**

#### **Bioinformatics**

For applications such as BLAST large query and reference datasets are partitioned into M and N subsets, which are combined into MxN unique pairs and processed in parallel using MxN tasks.



Divide

and

# Conquer.

Quickly scale your applications on massively parallel HPC clusters!

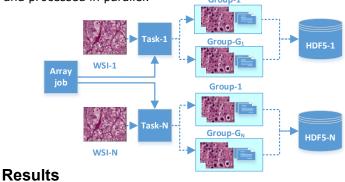


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### **Digital Pathology Deep Learning AI**

Large-size gigapixel whole-slide images (WSI) are partitioned and grouped in hierarchical data format (HDF5) files, designed for concurrent access, and processed in parallel. Group-1



- Applying BLAST to one of the FDA Bioinformatics projects reduced run time from 27 days to a single day using 4,104 tasks (where M=152, N=27 subset size 100 MB), each task taking less than 7 minutes to complete.
- CAMELYON datasets of 399 WSIs (>700 GB) were partitioned into 27,280 groups of ~230 MB in 399 HDF5 files for testing a DLNN. With 27,280 tasks this might take upwards of 18 years on a single CPU core, 30 days on a single GPU or less than 45 hours when implemented in parallel on the HPC.

# Conclusions

- The scaling techniques presented here are already in use by FDA scientists.
- The techniques enable reduction of the data subset processed by each job task to a size that fits into the memory of the computing nodes where computations are performed. This avoids expensive I/O for swapping and produces excellent results, enabling substantial drops in run times.
- The described methods use only open source code, adds no hardware cost.

#### Acknowledgments

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2. Mikailov, M., Qiu, J., Luo, F.-J., Whitney, S., & Petrick, N. (2020). Scaling modeling and simulation on high-performance computing clusters. *SIMULATION*, 96(2), 221–232. https://doi.org/10.1177/0037549719878249