

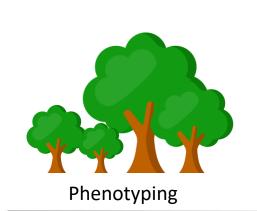
# Accelerated Genomics and Al for Advanced Precision Breeding

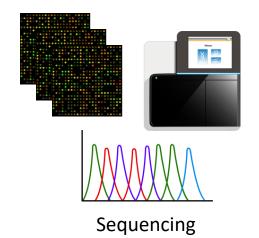
Dr. Eric T. Dawson

Senior Scientist, Genomics and AI @ NVIDIA

# Precision breeding is a resource-intensive process

Identifying genetic components to edit requires significant time, sequencing, and compute resources





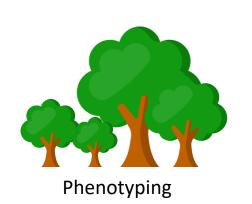


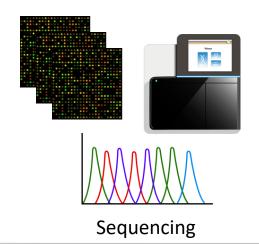


Bioinformatics + Association Testing

# Precision breeding is a resource-intensive process

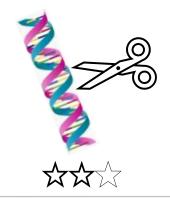
NVIDIA's tools can help make this process faster, cheaper, and more accurate, facilitating discovery.























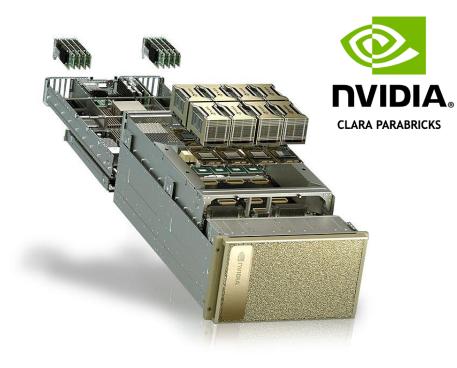






# **Accelerating genomics with NVIDIA GPUs**

Support and solutions across major short- and long-read sequencing and analysis platforms





























# **Across the Computational Genomics Workflow**

From sequencing sensor to biological insights









DNA Basecalling



Basecall polishing



Alignment / assembly



Variant calling



Interpretation / modelling

Primary —

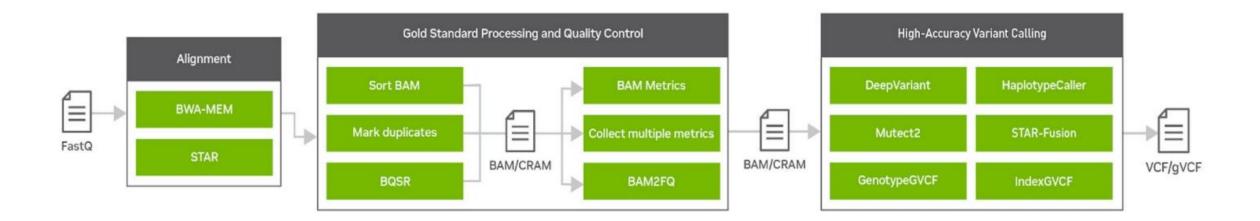
Secondary -

- Tertiary —



#### **NVIDIA Clara Parabricks**

#### Accelerated genomics powered by NVIDIA GPUs





#### **Key Applications**

Industry-standard germline, somatic and RNA tools



#### Up to 80x Acceleration

Up to 80x faster & 50% cheaper for WGS than CPU-only



#### Flexible Workflows

Customizable & scalable workflows for high throughput analysis



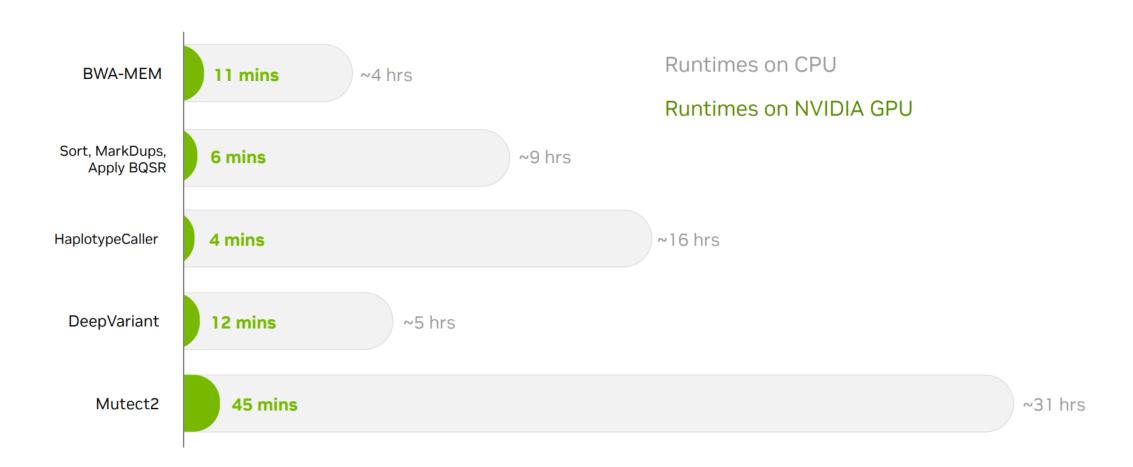
#### **Better Accuracy**

The power of deep learning for high accuracy analysis



# **Parabricks Acceleration**

High Speed Option: Up to 80x faster on the NVIDIA DGX

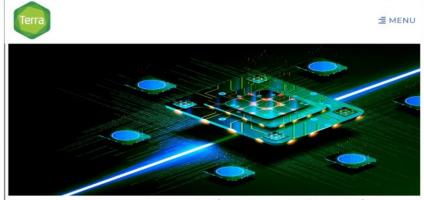






### Parabricks Scale & Cost

Cost Effective Option: 50% cheaper



#### NVIDIA's Clara Parabricks workflows in Terra bring GPU acceleration to genomic analysis



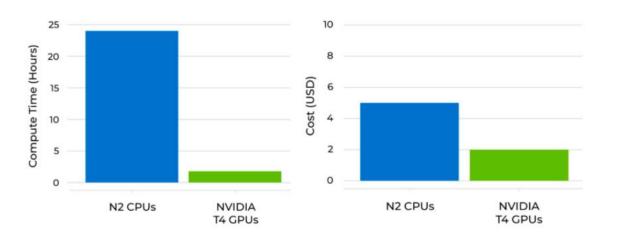
September 20, 2022

The past few years have seen a massive surge in the development of advanced analytical methods for biomedical research, fueled in part by technological innovations that allow computational scientists to crunch data at ever-increasing speed and scale. A growing number of technology companies have joined the effort to help researchers tackle emerging challenges, ranging from large-scale genomics to multi-modal analysis of the myriad data types associated with medical records — including doctors' notes, which are famously easy to read and interpret.

Today NVIDIA, a pioneer in Al and accelerated computing, announced a new partnership with the Broad Institute that will pool the two organizations' respective expertise in deep learning, accelerated compute, and biomedical research. This partnership builds on an existing collaboration between NVIDIA and the Broad's GATK team, who have already been working together to improve some of the deep learning algorithms in GATK. (Keep an eye on the GATK blog for an upcoming release announcement.)

The NVIDIA team released a Clara Parabricks workspace in Terra that makes their GPU-accelerated genomic analysis toolkit available on the cloud at the click of a button. As



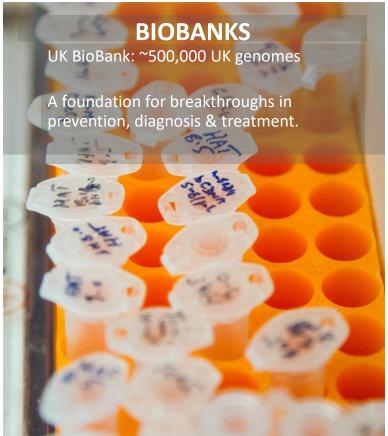


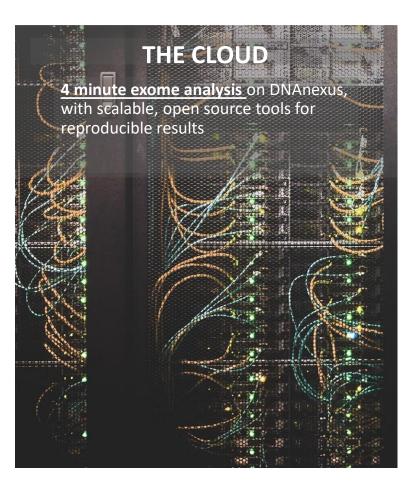


# **Enabling Genomics at Industrial Scale**

Over 1 Million Whole Exomes Analyzed



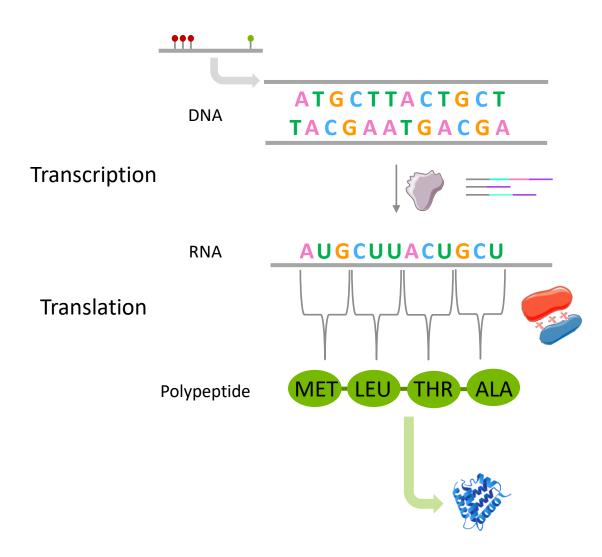






# Genotypes alone do not fully explain function

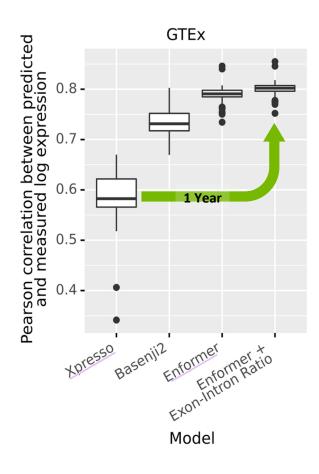
A more complete picture of the Central Dogma includes epigenetic marks; RNA splicing and modifications; protein structure, folding, and binding

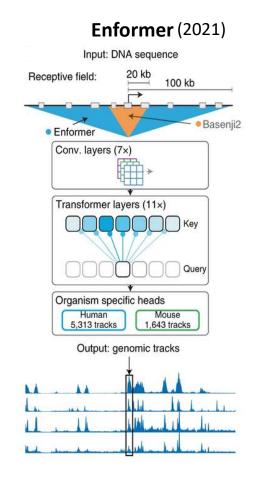


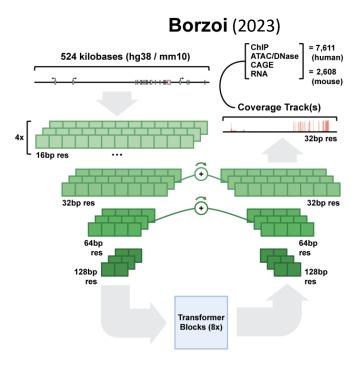


# Al models are learning the complexity of the Central Dogma

Transformer models (such as Enformer), for example, are rapidly improving at predicting gene expression from sequence data









# BioNeMo accelerates Al-driven generative biology

Nine state-of-the-art models and growing, all running on NVIDIA DGX Cloud

#### Protein Learned Sequence & Structure Protein Generation **Protein Structure Prediction** SAAAGATTAGCAAGATCAC CAAATACATTCAATAAGAC Q I H S I R **ESMFold** ESM1nv Amino Acid Sequence Amino Acid Learned OpenFold Protein Amino Acid ProGPT2 ESM2 Sequence Generation Sequence Embeddings AlphaFold2 Sequence Structure Molecular Generation Molecular Docking 3 Molecule MoFlow Molecule Docked Structures DiffDock **SMILES** MegaMolBART Generation Structures

**NVIDIA DGX Cloud** 



#### How can we use this technology to address challenges in meeting global food demand?



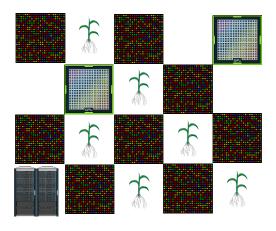
#### Make analysis more accessible

Reduce time and resources required

Enable labs without significant infrastructure to contribute

Cloud-ready; run anywhere there are GPUs

Expand AI training availability to more organizations and non-model organisms

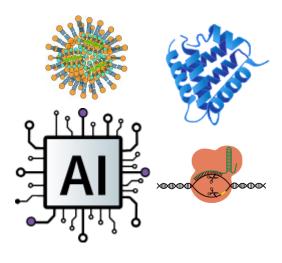


#### Scale the size of experiments by 10-100X today

Analyze 10-20X the number of samples for same runtime

Utilize accelerated tools for image analysis, data science, etc. to automate the entire pipeline

Discover more rare candidate variants by increasing sample size



# Discover more candidates using Generative / Predictive Biology

Guide experiments using predictive AI

Predict off-target effects before running expensive experiments

Discover candidate variants hidden in complexity

Develop models that can generate strong candidates



