

# PhytoOracle: A scalable, modular data processing pipeline for phenomic data

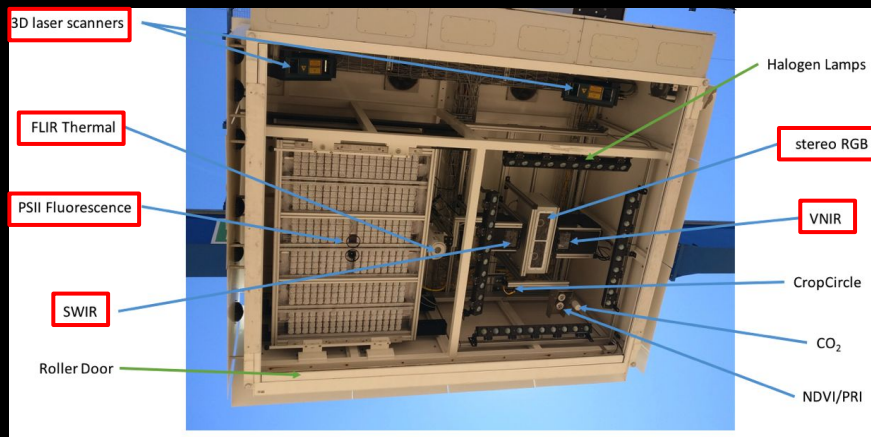
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Pauli, Eric Lyons



**PhytoOracle**

# Obtaining and extracting high-quality phenomic data



Data volume:

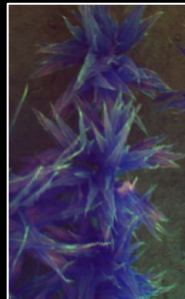
- Max: 10 TB/day
- Typical: 1.5 TB/day



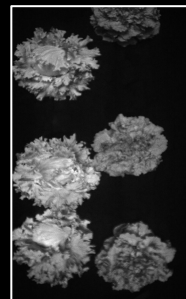
3D



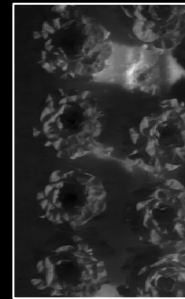
RGB



Hyperspectral



Fluorescence

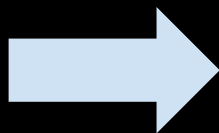


Thermal

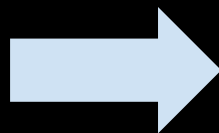


# PhytoOracle pipeline workflow

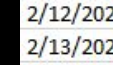
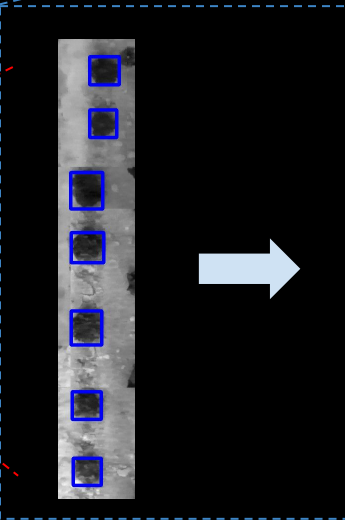
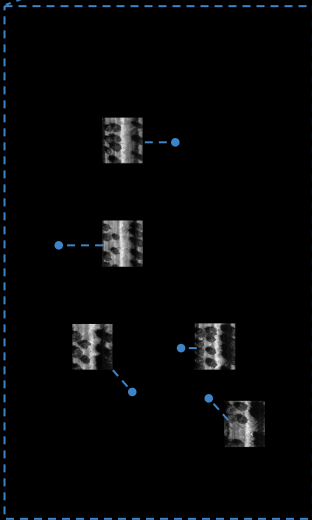
Raw  
Images



GPS correction,  
Orthomosaic,  
Plot clipping



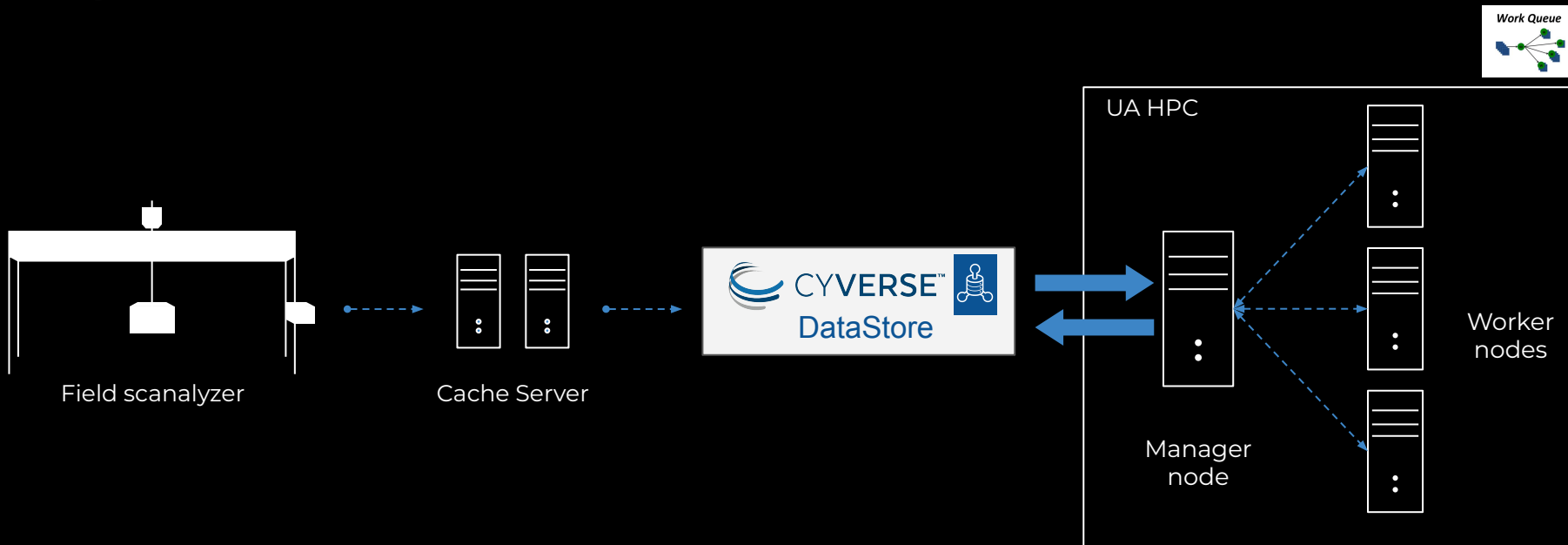
Phenotype  
Quantification



date	treatment	genotype	roi_temp
2/3/2020	treatment 1	GRxl_1074	290.8565674
2/4/2020	treatment 1	GRxl_1074	280.3588867
2/5/2020	treatment 1	GRxl_1074	288.3753357
2/8/2020	treatment 1	GRxl_1074	298.1218567
2/11/2020	treatment 1	GRxl_1074	293.346344
2/12/2020	treatment 1	GRxl_1074	293.0809326
2/13/2020	treatment 2	Trianon	293.035553
2/14/2020	treatment 3	GRxl_1010	296.1292114
2/15/2020	treatment 1	GRxl_1074	296.0202637
2/16/2020	treatment 1	GRxl_1074	295.1908875
2/17/2020	treatment 1	GRxl_1074	298.5577393
2/18/2020	treatment 1	GRxl_1074	298.7333374
2/19/2020	treatment 1	GRxl_1074	299.1886902



# Data flow and distributive framework



Scalability exponentially reduces data processing times

How much time would it take to process\* a single season worth of RGB data (50TB) on a 4-core, regular lab computer?

**55 years!**

\* From raw data to a quantifiable phenotype

How much time would it take PhytoOracle to process\* a single season worth of RGB data (50TB)?

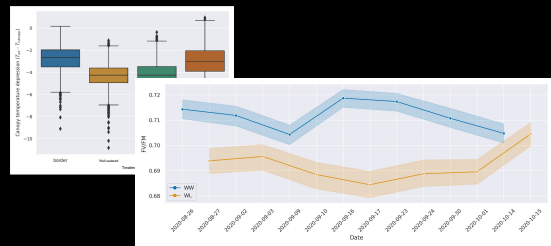
**Only 6 days!**

\* From raw data to a quantifiable phenotype



# Object detection made easy

- Object detection
  - <https://tinyurl.com/objectnotebook>

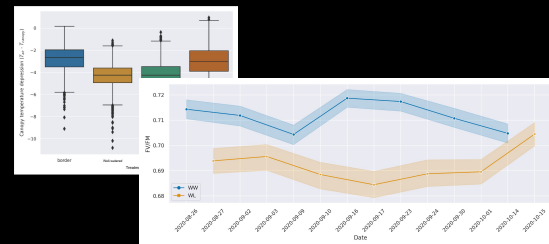






# Visualizing output phenotype data

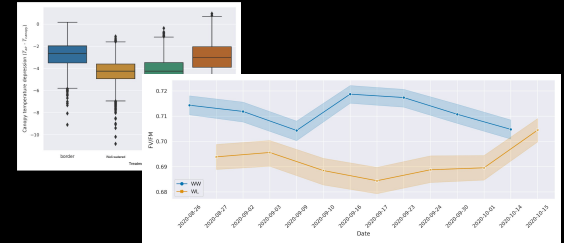
- Visualizing phenotypic trait outputs on streamlit
  - <https://tinyurl.com/streamlitapp>





# Today's tutorial

- Run 3D workflow using PhytoOracle



# Workshop Preparation

Log in to atmosphere

- <https://cyverse.org/atmosphere>
- Click 'Projects'
- Click 'PhytoOracle'
- Click 'PhytoOracle'
- Click 'Open Web Shell'

# Resources

Documentation:

<https://tinyurl.com/phytooracle-rtd>

Containers:

<https://github.com/phytooracle>

Workflows:

<https://github.com/LyonsLab/PhytoOracle>

Data:

<https://tinyurl.com/cyverse-datacommons>

Orthomosaics (10% resolution):

<https://tinyurl.com/bisque-orthomosaics>



# Closing Remarks

We thank the NAPPN team.

We also thank the Cyverse staff for the iRODS and virtual machine troubleshooting.

We finally thank Drs. Duke Pauli, Kobus Barnard and Eric Lyons for their support and leadership.

