

MOISTURE

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MODERATE



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FarmVibes: AI, Edge, & IoT For Agriculture

Ranveer Chandra

We need to increase **production** and decrease **environmental impact**



Over **820 million** people worldwide suffer from hunger



More than **2 billion** people lack vital nutrients



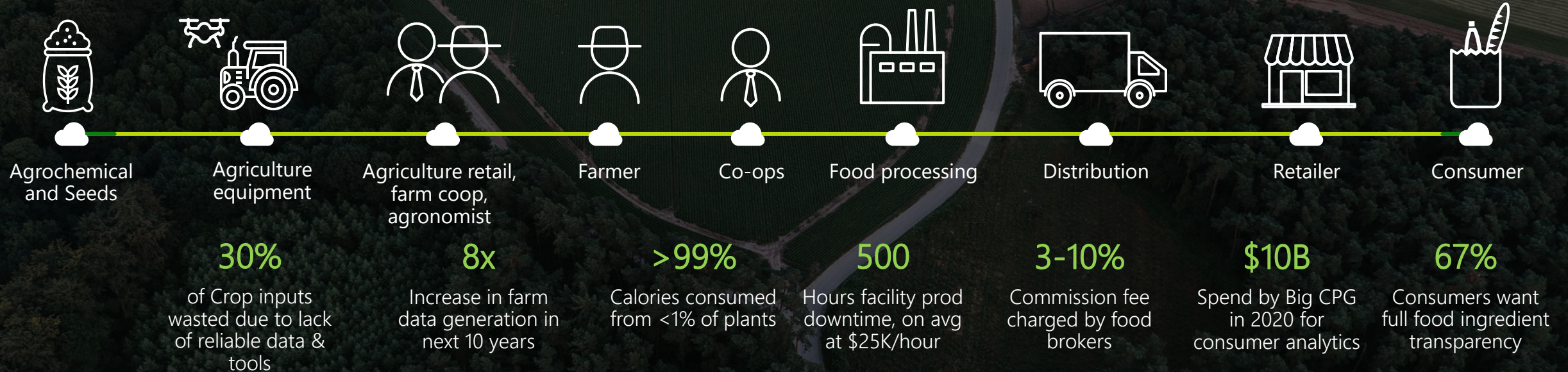
50% more food is needed by 2050.
40% food wasted.



31% GHG emissions from agri-food systems,
70% fresh water use

Data-driven Agri-Food systems

Bringing data to the cloud enables key insights for individuals and organizations.



When this data is shared, we unlock greater efficiencies and productivity across the supply chain.

Data-driven agriculture

Precision & regenerative agriculture has been shown to:



Improve yield



Reduce cost

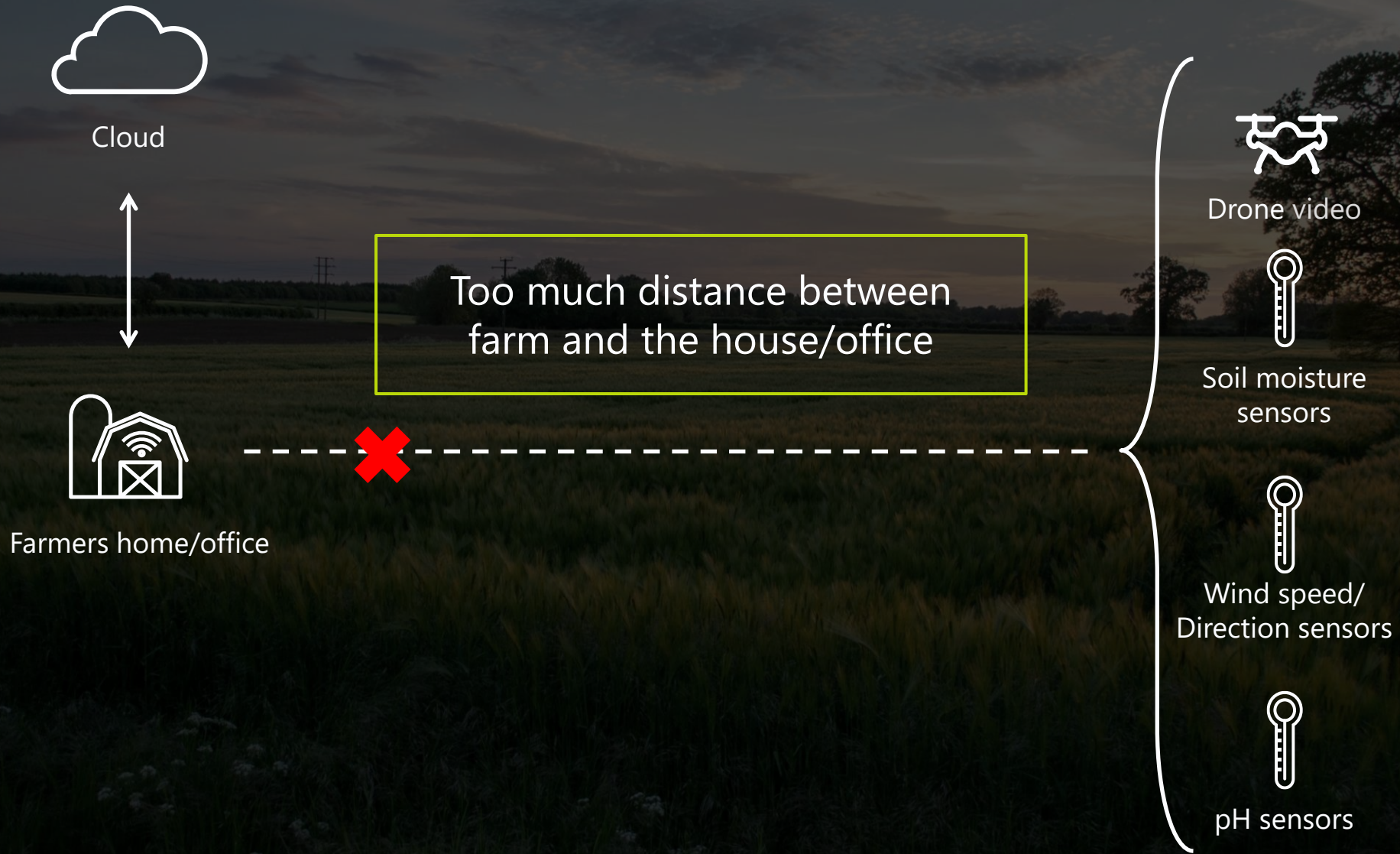


Ensure sustainability

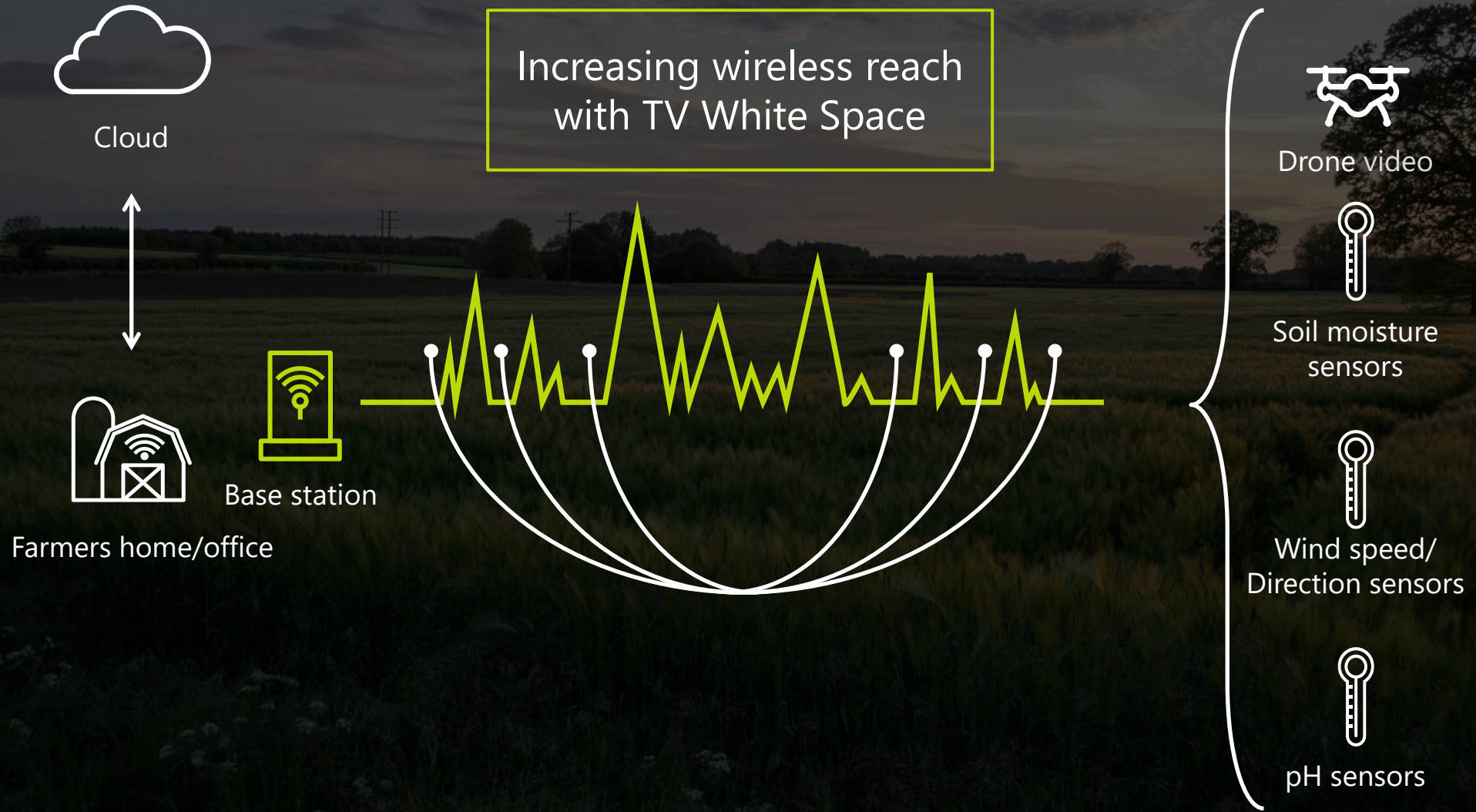
An aerial photograph of a rural landscape. A central river flows through the scene, bordered by dense green forests. On either side of the river are agricultural fields. The fields on the left and right are brown, suggesting they are either fallow or have been recently harvested. The field in the center, between the river and the forest, is a vibrant green, indicating it is currently growing crops. The overall scene is a mix of natural and agricultural environments.

According to USDA, **high cost of manual data collection** prevents farmers from using data-driven agriculture.

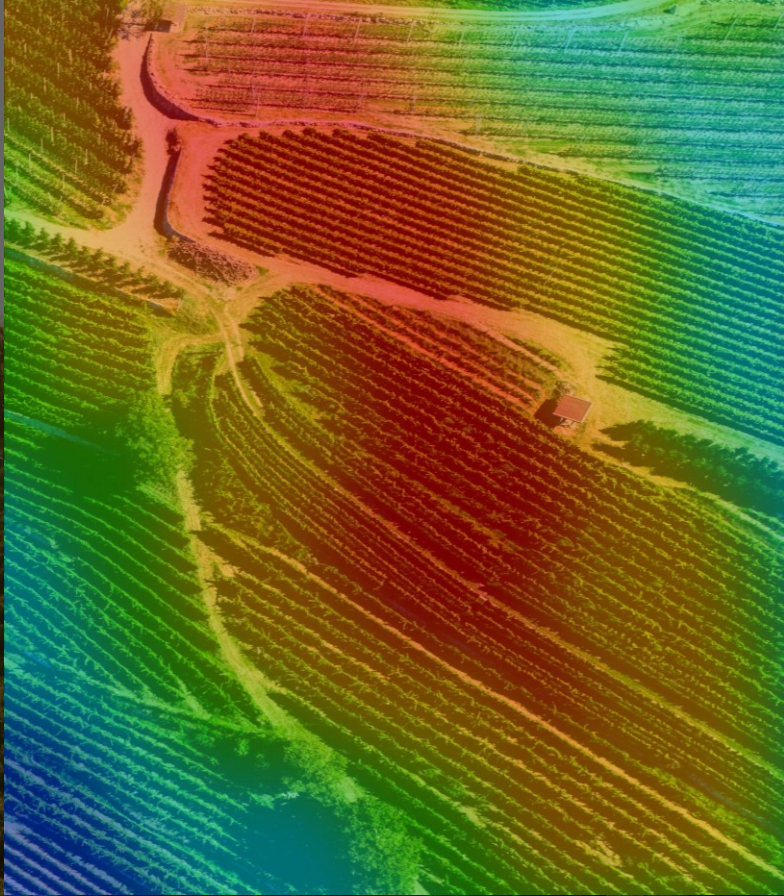
Challenge 1: Connectivity on farms



A solution in white space



Challenge 2: Sparse sensor deployments



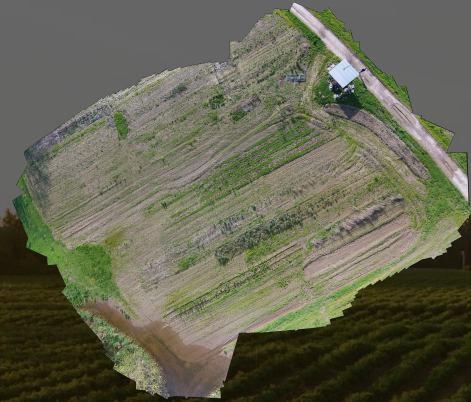
- Physical constraints due to farming practices
- Too expensive to deploy and maintain

How do we get coverage with a sparse sensor deployment?

Use aerial imagery and AI to enhance spatial coverage



Aerial imagery



Panoramic overview



Sensors



Machine Learning

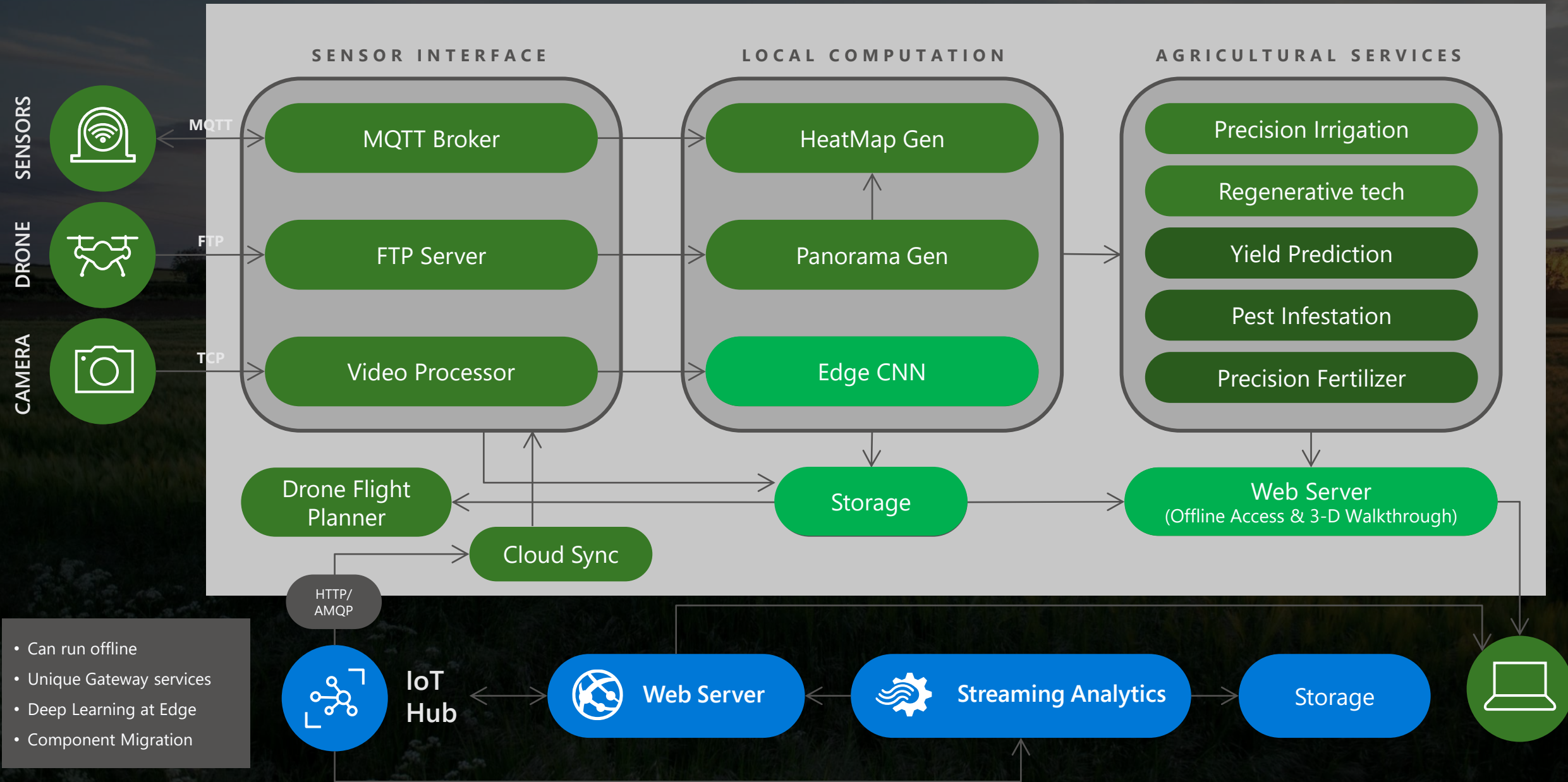


Precision map

Edge Compute in the Farm



IoT Edge



Deployment

Deployments in several locations including WA, CA, NY

Farm sizes range from 0.5 – 9000 acres

Sensors:

- DJI Drones
- FarmBeats sensor boxes with soil moisture, temperature, wind speed/direction sensors
- IP Cameras to capture IR imagery as well as monitoring

Cloud Components: Azure IoT Suite



Micro-Climate Forecasting

Goal:

Microclimate weather forecasting model based on FarmBeats sensors in the field.

Impact:

Knowing microclimate enables better modeling of plant diseases, application timing, and risk management.

Challenges:

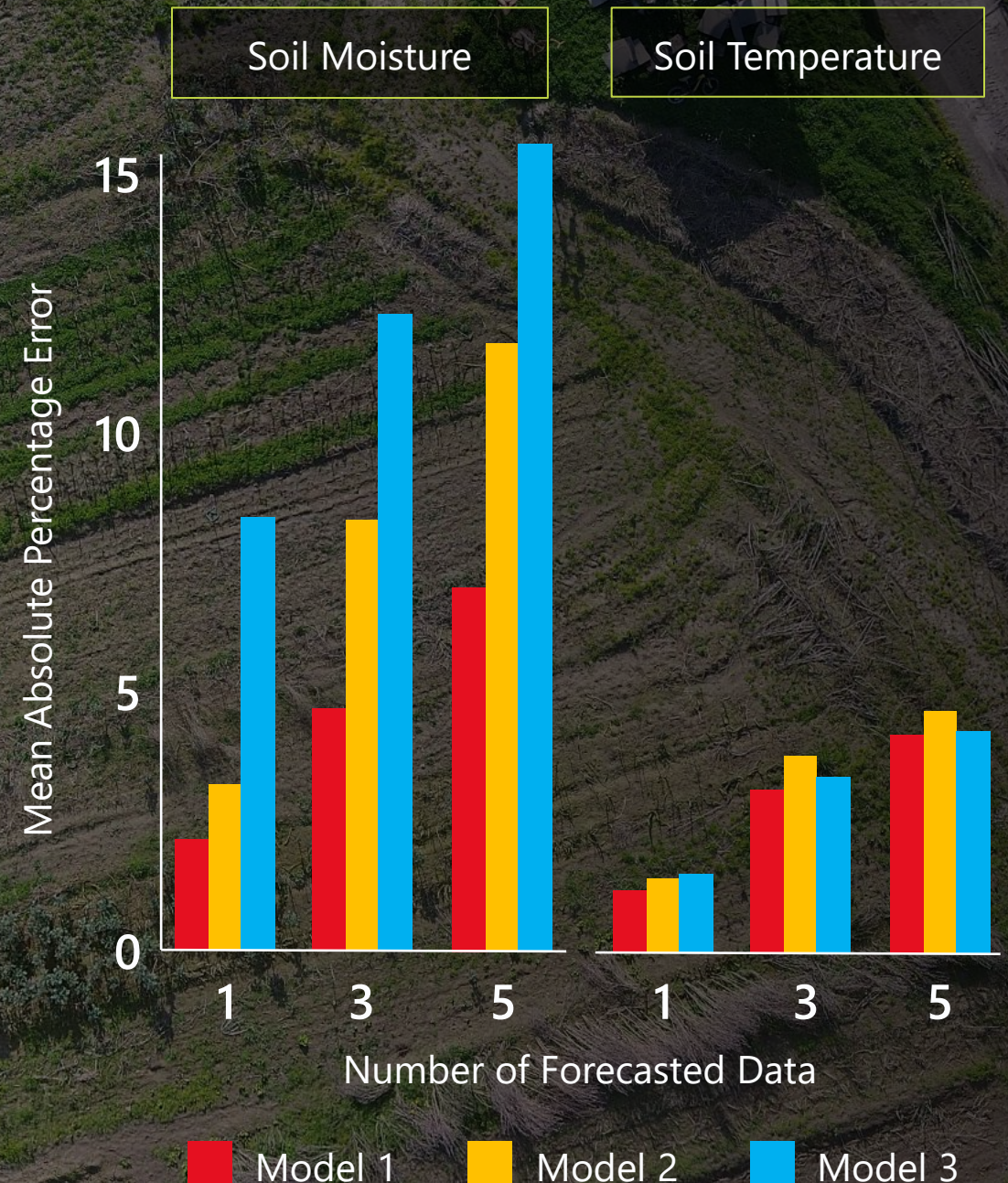
Forecast important variables for accurate plant disease prediction, not included in current weather forecasts (results shown).

Results:

Soil moisture & temperature forecasting error less than 10%.

Forecast for low temp was 42 degrees. Micro-Climate forecast was 31 degrees in lower areas of the field. Actual was 30 degrees. Instead of spraying grass herbicide, the farmer waited and avoided large crop damage in some of the most productive areas.

*The **lower the error**, the better the prediction.



Example: Panorama



Water puddle



Cow excreta



Cow herd

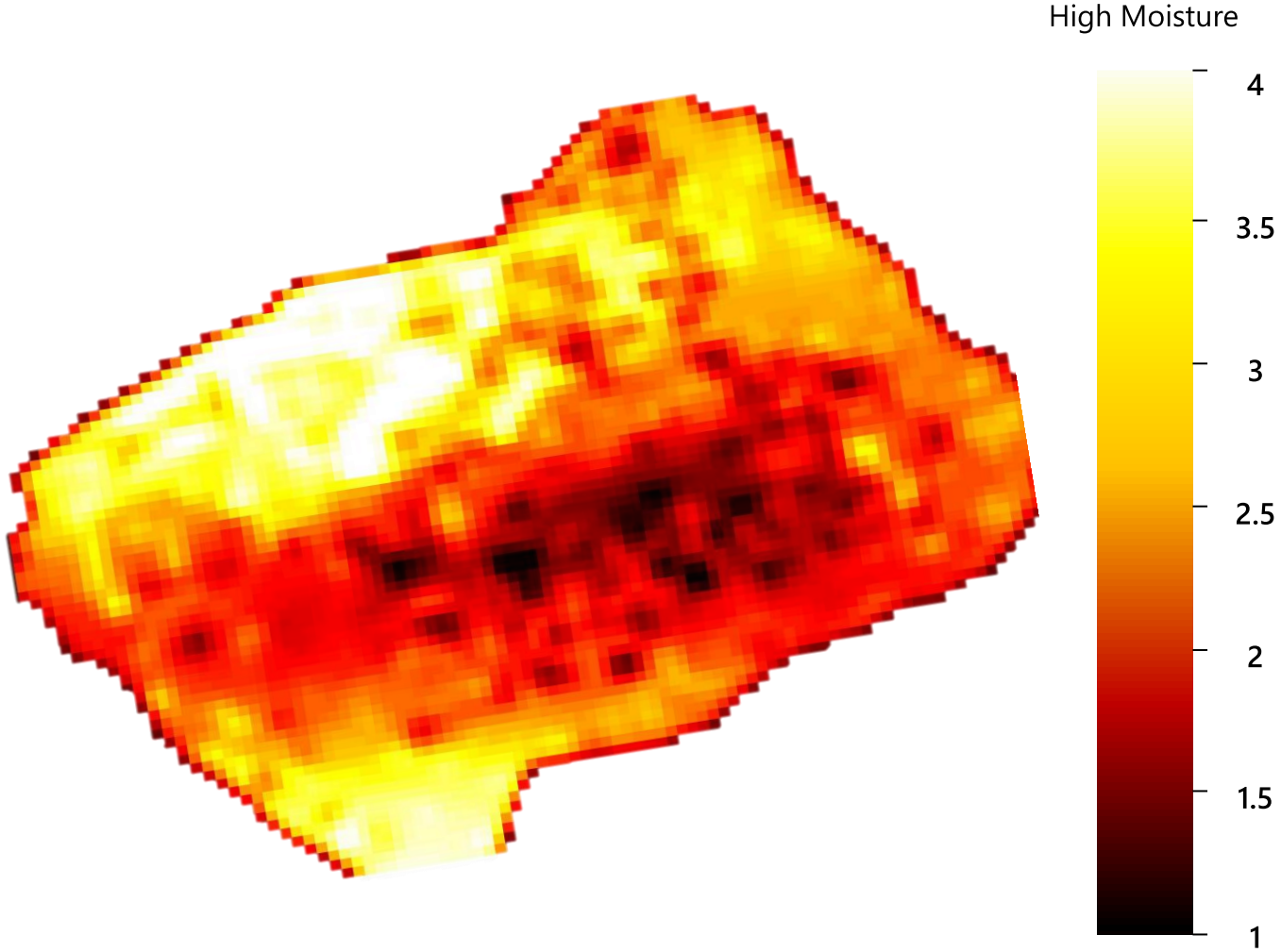


Stray cow

Precision Map: Panorama Generation



Precision Map: Moisture



High Moisture

4

3.5

3

2.5

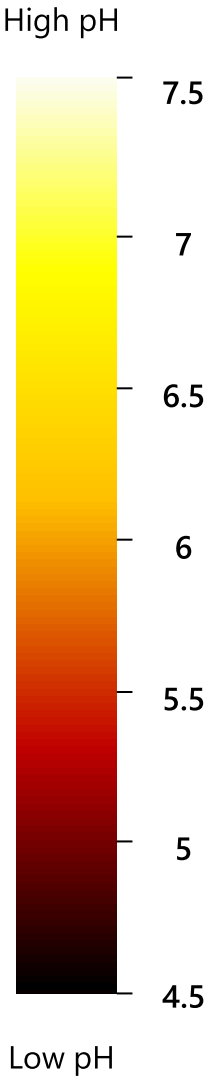
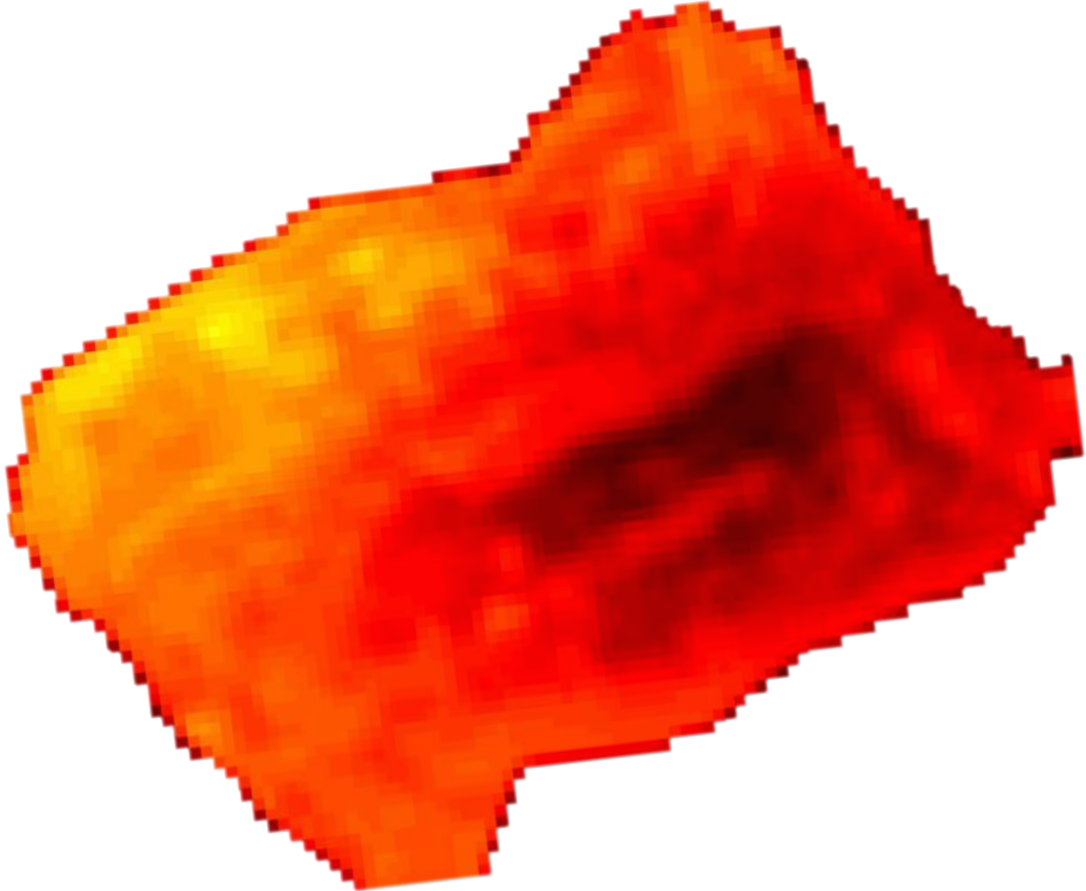
2

1.5

1

Low Moisture

Precision Map: pH

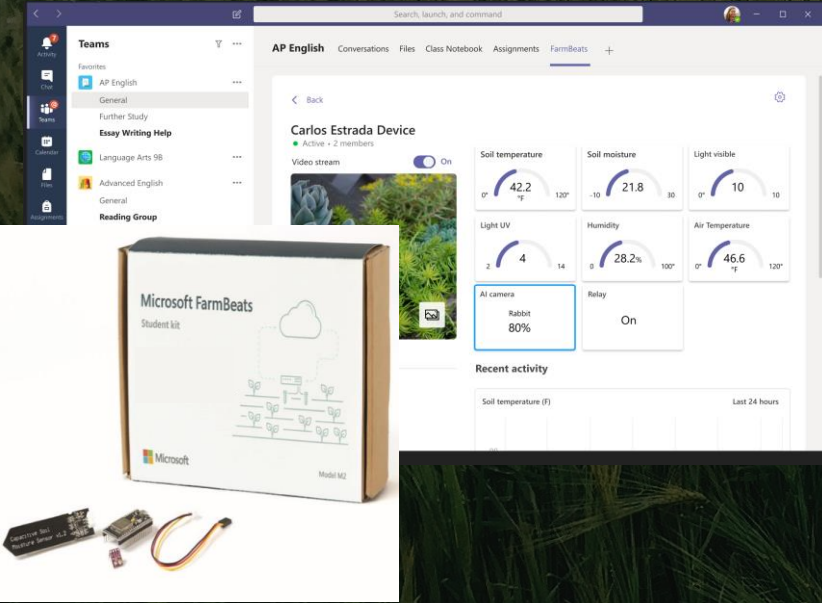


Application: Cow-Shed Monitor



Future Farmers of America + FarmBeats + FarmVibes

The Microsoft TechSpark initiative is bringing precision agriculture and AI to classroom with **FarmBeats student kits**.



Affordable sensing

low-cost soil moisture and EC sensing using Wi-Fi

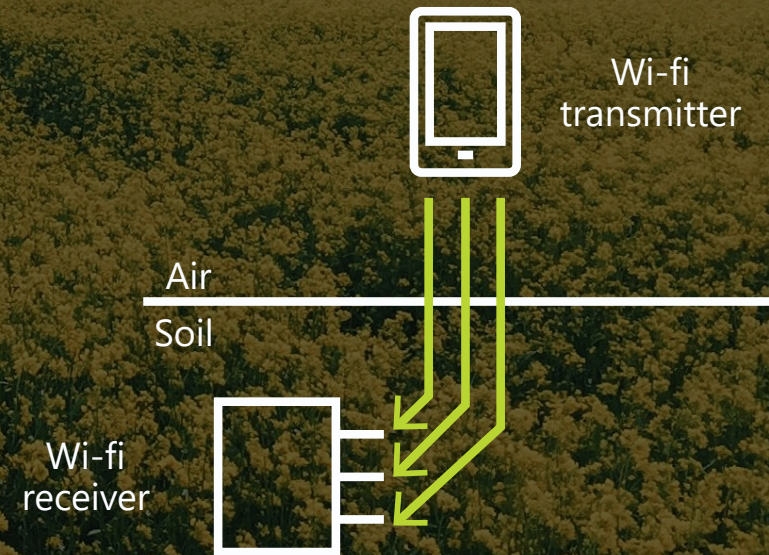
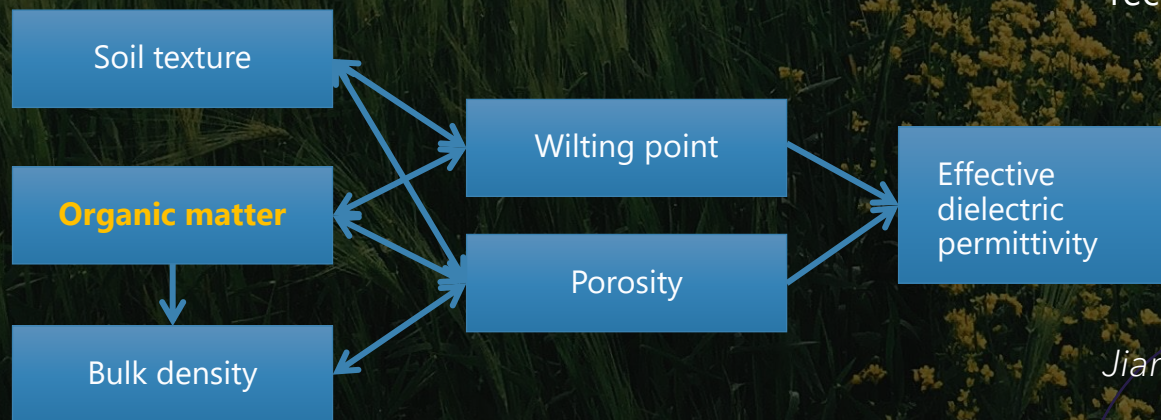
Motivation: existing sensors are expensive

- ~100s of dollars

Strobe design: Wi-Fi cards with 2+ antennas

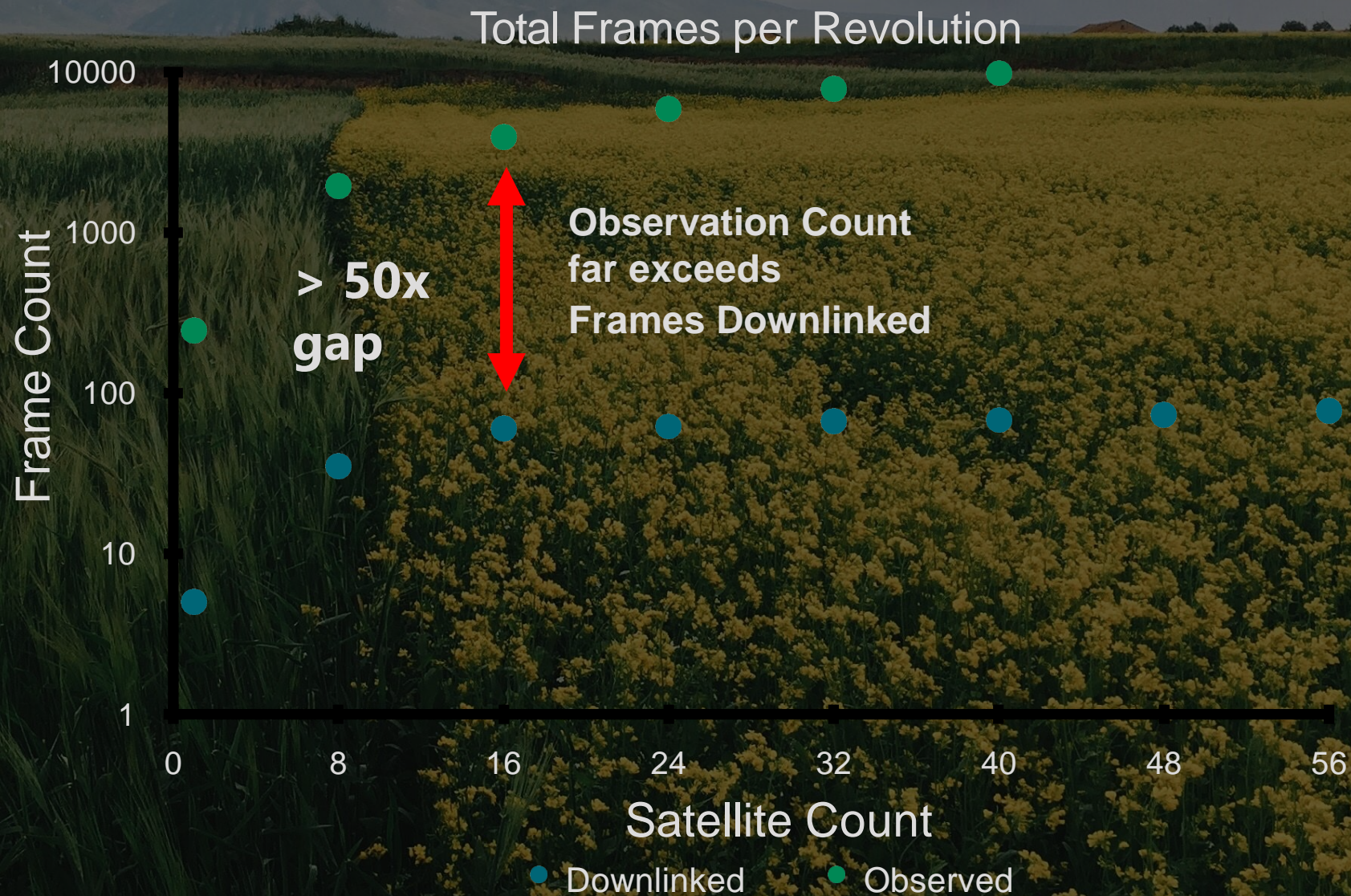
- Relative time-of-flight and amplitude

Results: Strobe can accurately detect moisture and EC change in soil



Edge in Space: The Downlink Bottleneck

Landsat-8

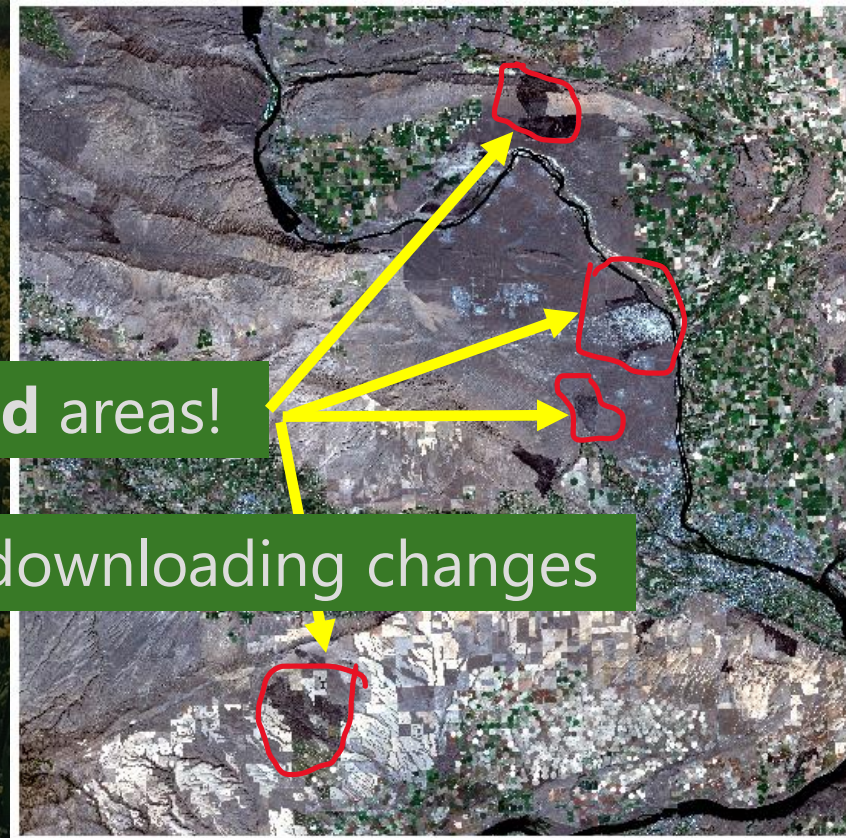


Key idea: Filter Out Low Value Data at Edge

09/2018, reference image

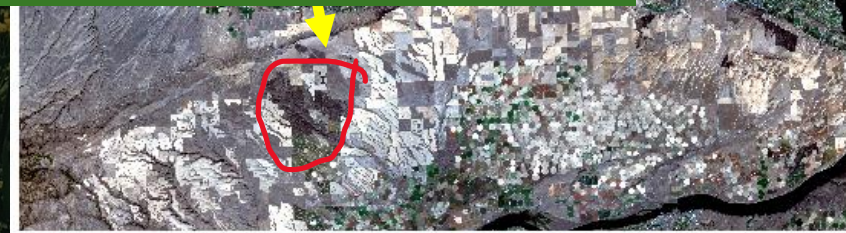


10/2018, captured image,



Only download **changed** areas!

Potential: **16.5x** compression when only downloading changes



Soil Carbon Modeling

Accurately models 78.6 % in changes in soil carbon using weather drivers, green house gas emissions, soil macro-nutrient information for test farms

Our Goal:

1. Model cause-and-effect relationship among soil processes.
2. Identify factors that cause changes in soil carbon.
3. Customizing process models for region-specific modeling

Machine Learning Paradigm:



Explicitly learn **cause and effect** relationships.



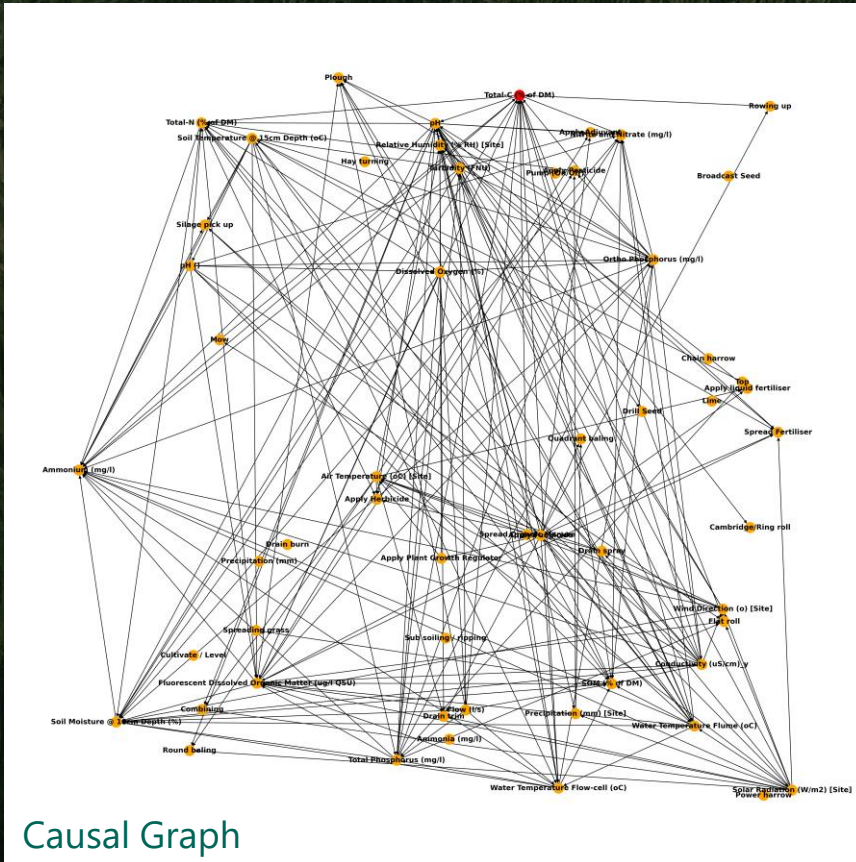
Incorporate **spatial-temporal** correlations.



Use **domain knowledge** to guide learning.

Example of Discovered Relations:

Discovered Causal Relations	Reasoning
Soil Temperature → Soil Carbon	Higher temperatures decomposes organic carbon
Soil Nitrogen → Soil Carbon	Nitrogen and Carbon co-metabolize in soil
Dissolved Oxygen → Soil Carbon	Dissolved oxygen in soil improves the organic matter content





 Microsoft

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