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NeurIPS Workshops
Tackling Climate Change with Machine Learning

Residue Density Segmentation for Monitoring and Optimizing Tillage Practices

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Past management decisions in the US have depleted soil organic carbon (SOC) by over **70 billion tons**

157 million hectares
of US Cropland with the capacity to
sequester **45-98 TgCarbon/year**

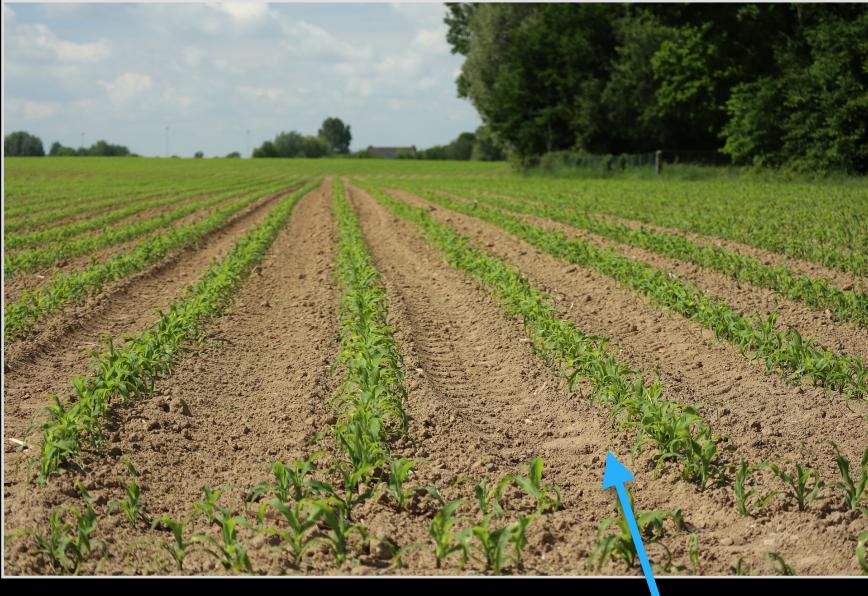
R Lal et al. Soil management and restoration for c sequestration to mitigate the accelerated greenhouse effect. *Progress in Environmental Science*, 1(4):307–326, 1999.

Adam Chambers, Rattan Lal, and Keith Paustian. Soil carbon sequestration potential of us croplands and grasslands: Implementing the 4 per thousand initiative. *Journal of Soil and Water Conservation*, 71(3):68A–74A, 2016.

Rattan Lal. Sequestering carbon and increasing productivity by conservation agriculture. *Journal of Soil and Water Conservation*, 70(3):55A–62A, 2015.

Carbon Sequestration and Tillage Practices

Traditional Till



No residues present

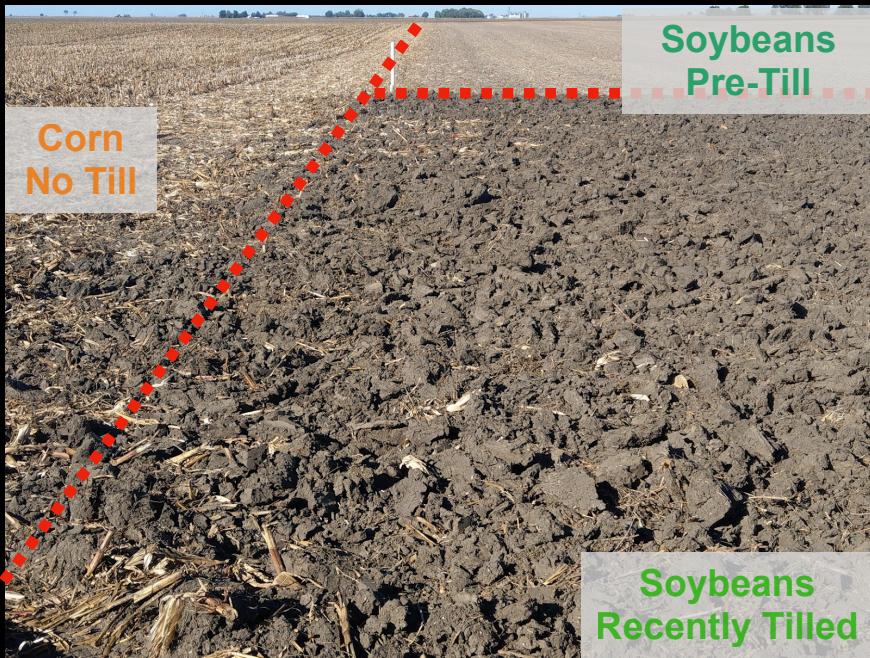
Residue nutrients reincorporated into soil
Soil carbon released back into atmosphere
Increased compaction which can inhibit growth

No Till

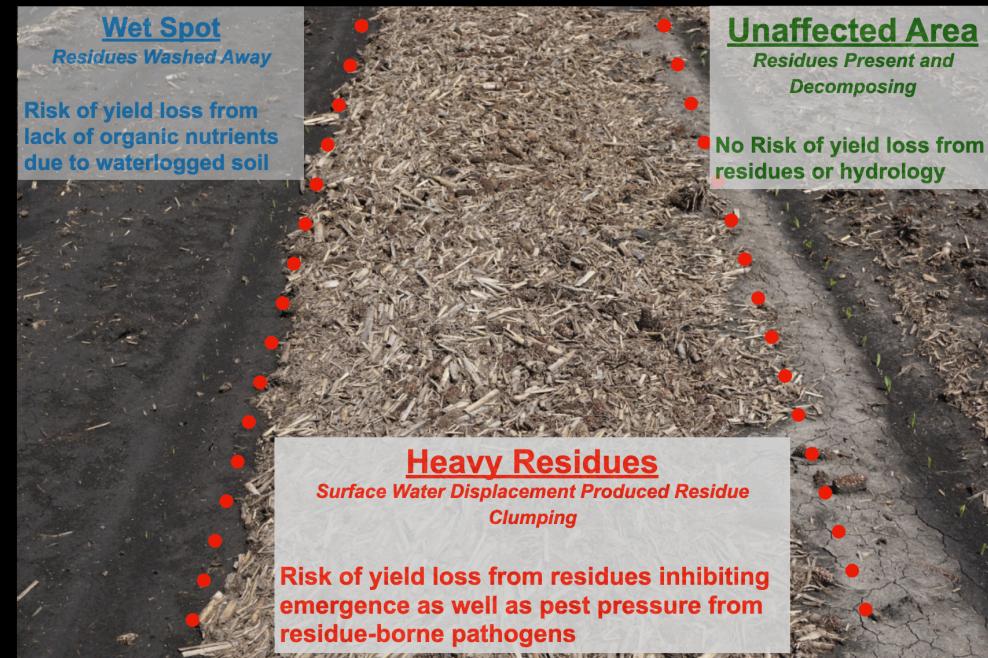


Residues left behind

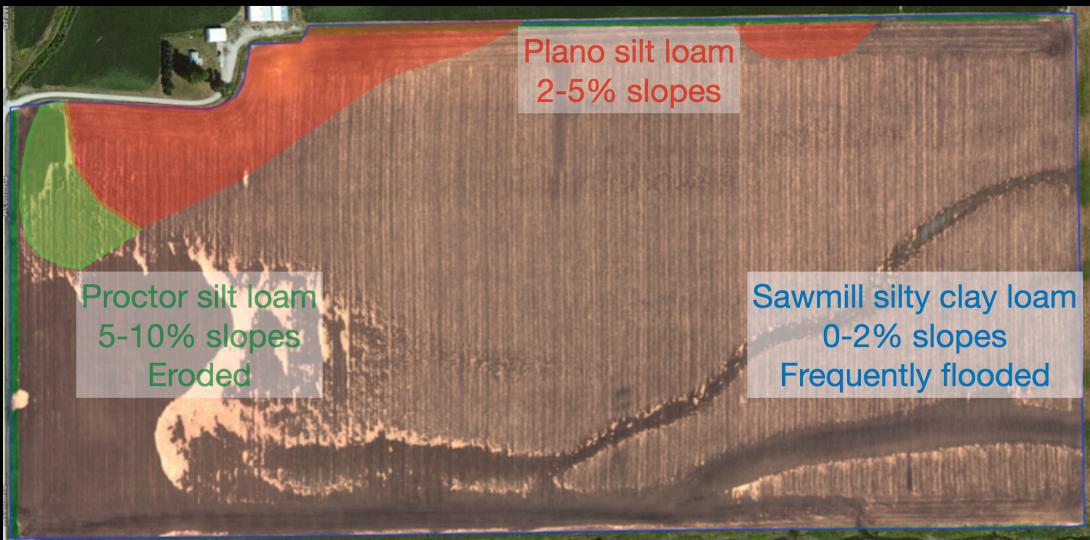
Less reincorporation of residue nutrients
More carbon remains stored in the soil
Heavy residues can harbor disease and pests



Numerous factors at play

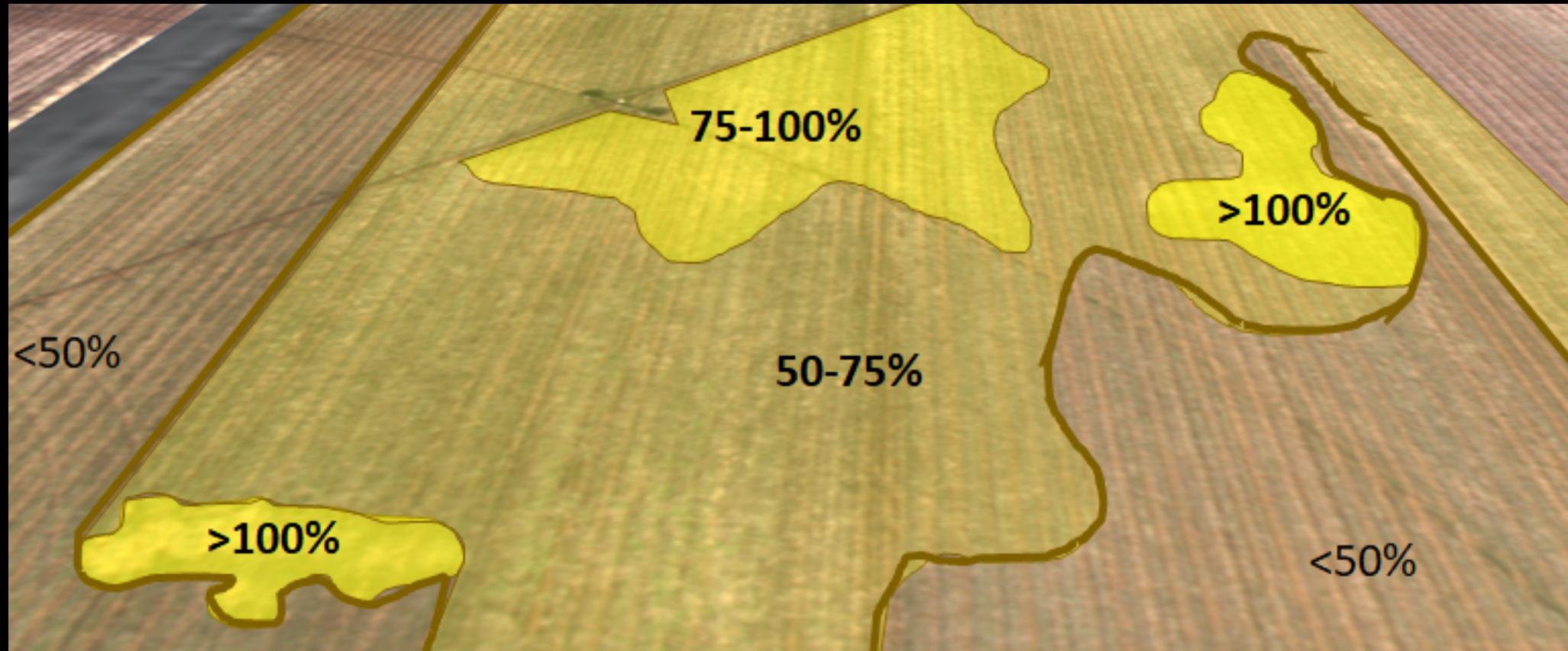


Impact the capacity to store carbon

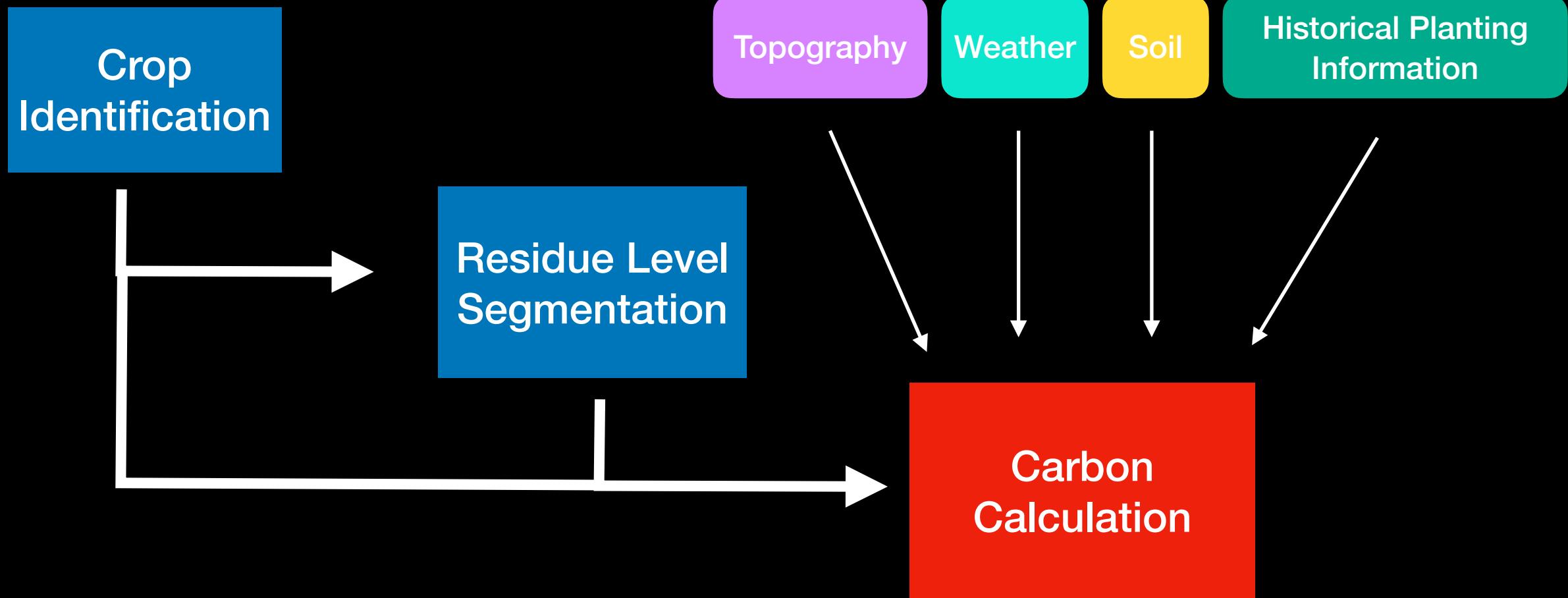


Impact the appearance of tilling practices

Goal: Segmentation of Residue Density Regions



More precise and informative than simply classifying a field as “till” or “no-till”



Residue levels and other information can be combined into more precise and accurate carbon calculations

METHOD

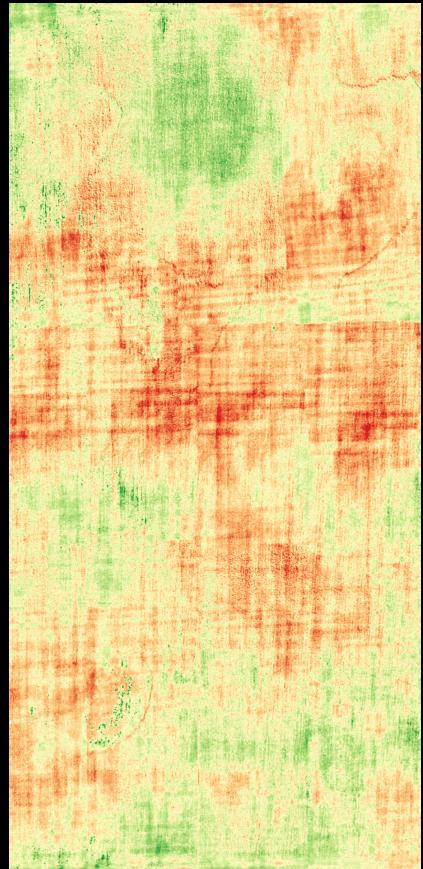
1. High-Resolution (<1m/pixel) Aerial Imagery and Other Channels



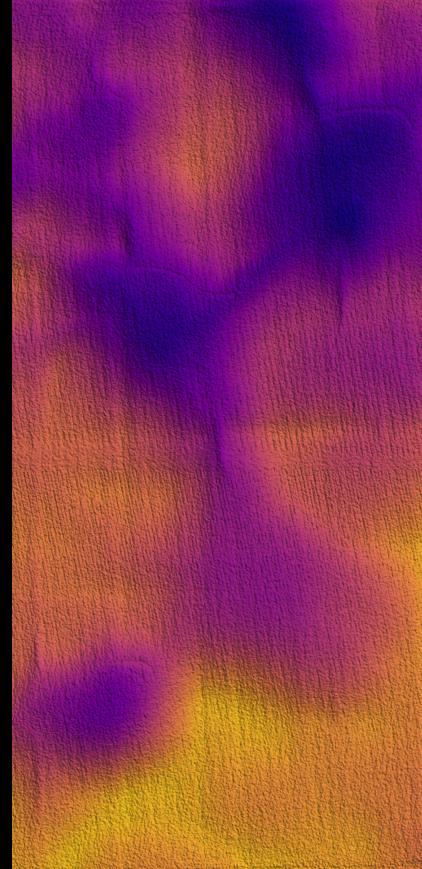
RGB



CIR



NDVI

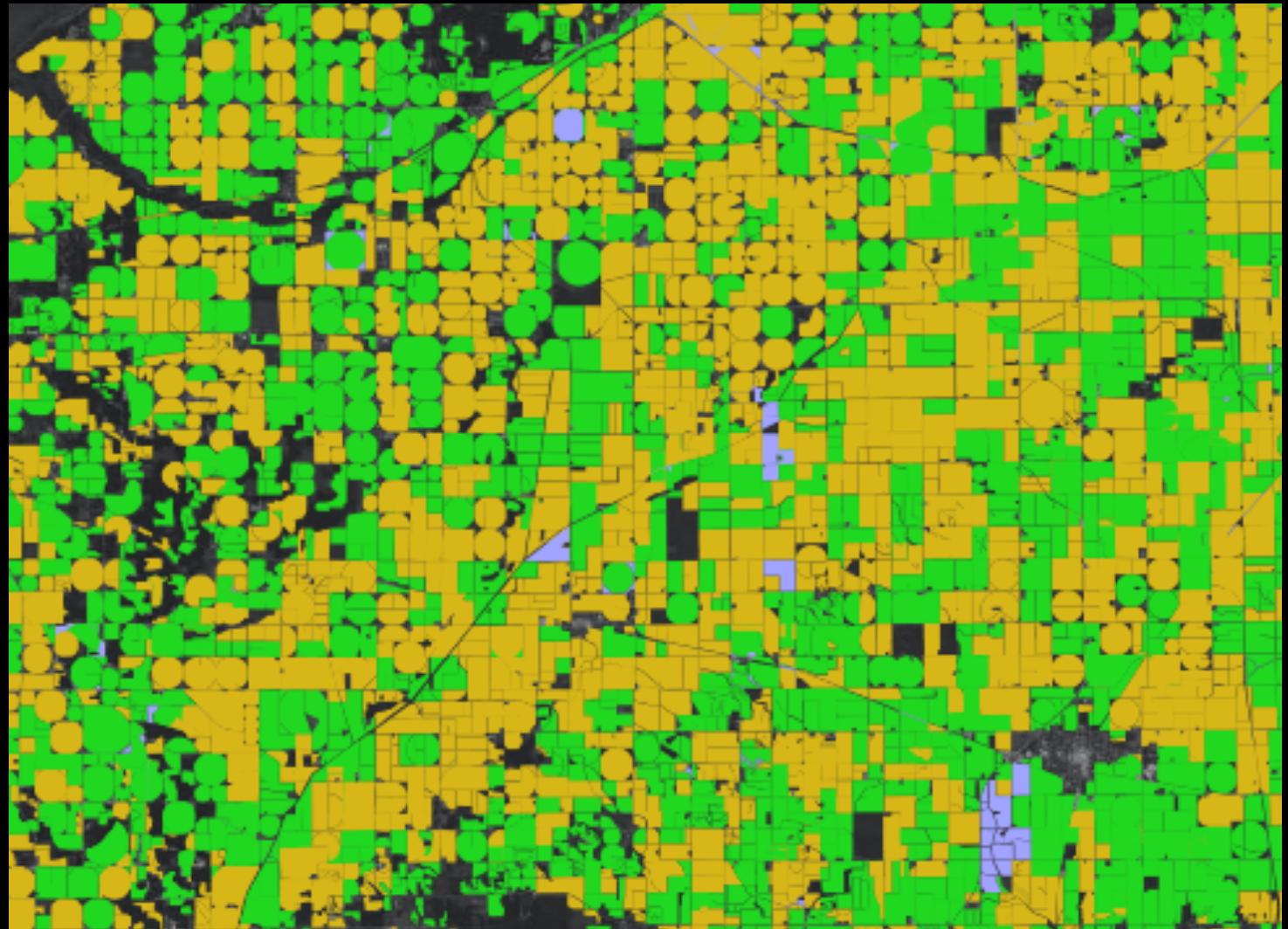


TOPO

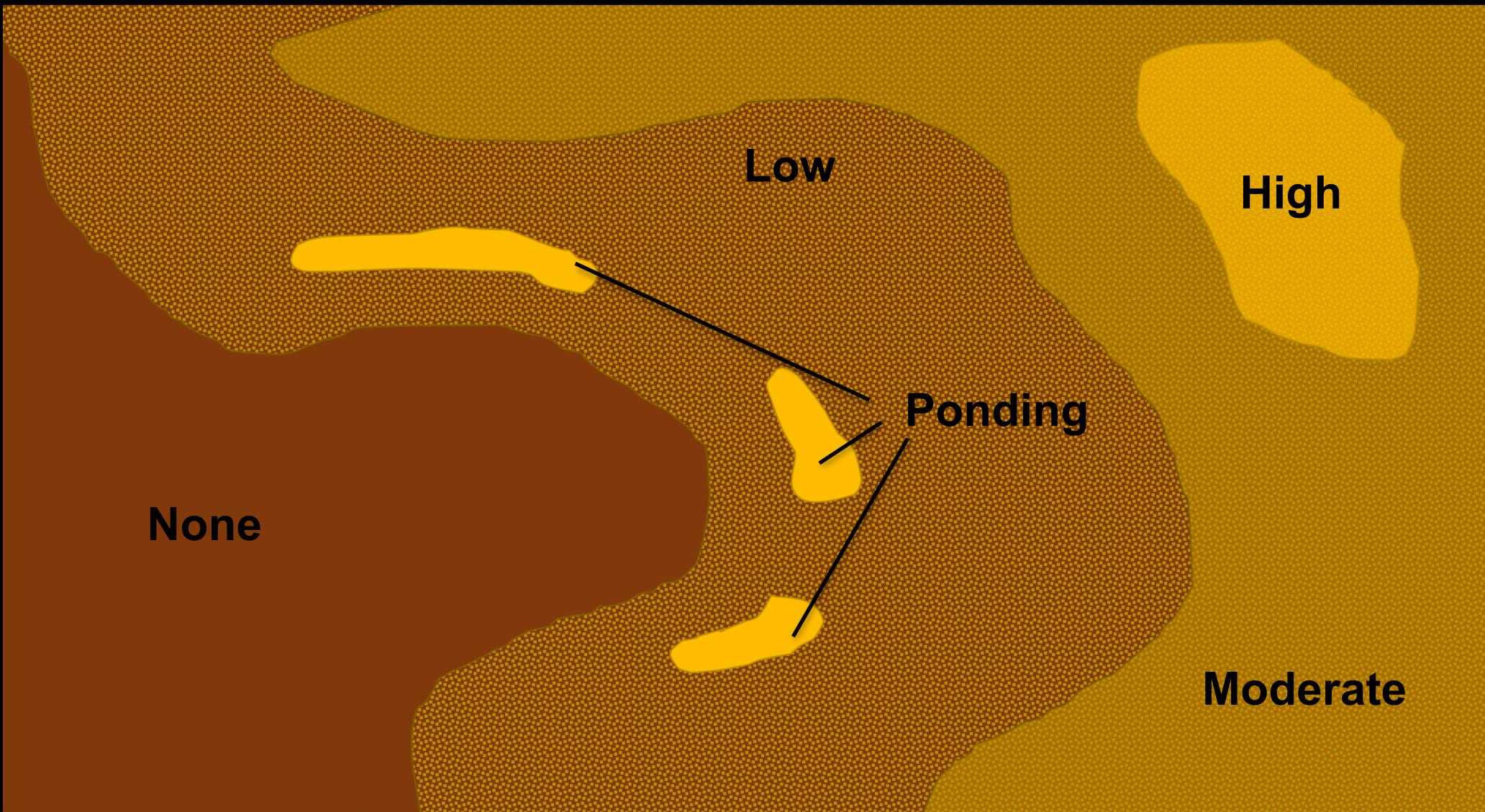


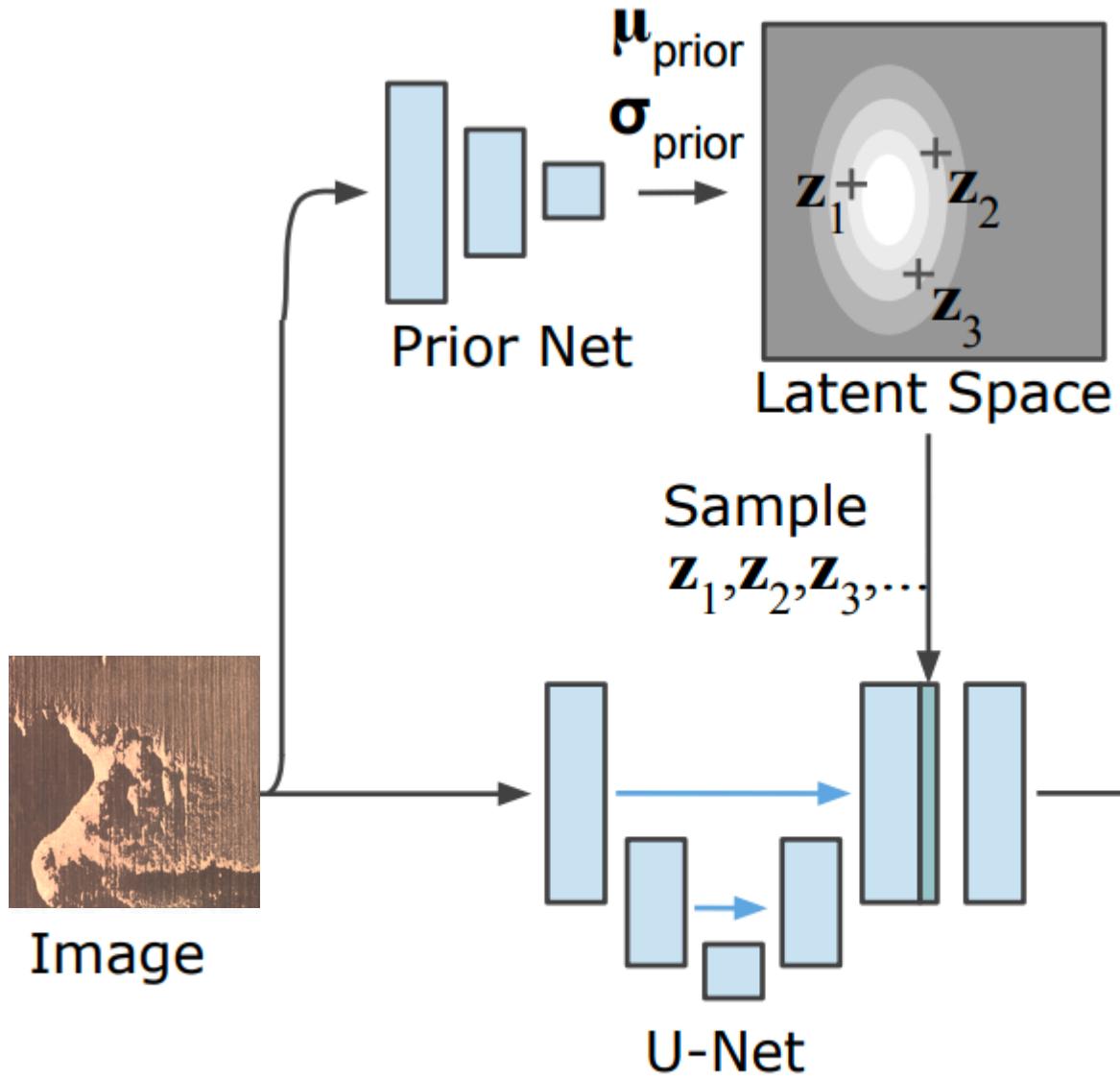
SOIL

2. Previous season
crop identification
from collected high-
resolution or publicly
available low
resolution imagery

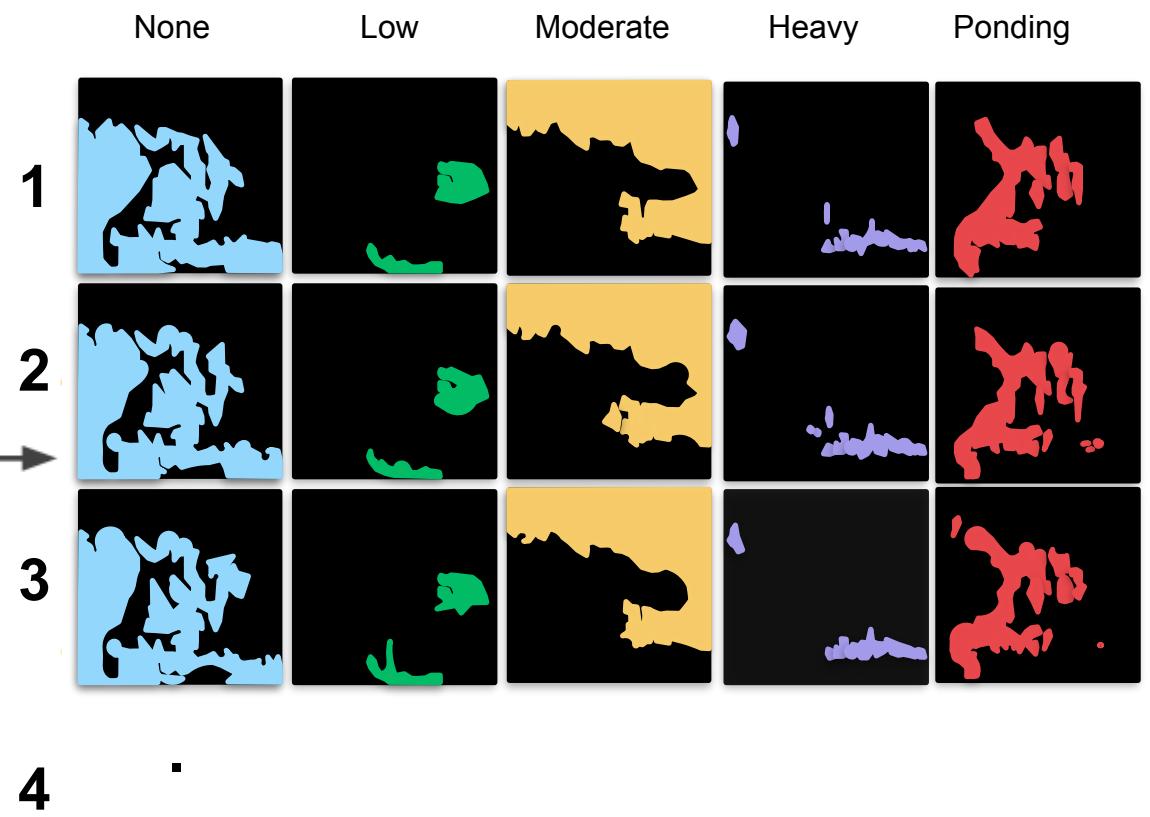


3. Annotate residue density regions on the field





4. Segmentation using a Probabilistic U-Net¹



[1] Adapted from Kohl, Simon, et al. "A probabilistic u-net for segmentation of ambiguous images." *Advances in neural information processing systems* 31 (2018): 6965-6975.

Key Benefits

More precise carbon calculations

Precision tillage: alert farmers to problematic areas

Build trust and adoption

Environmentally **and** economically sustainable
management practices

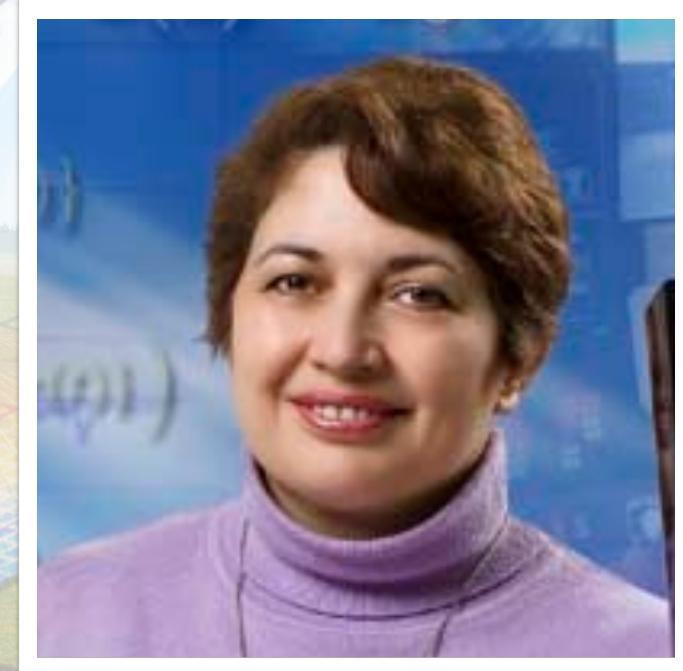
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Please reach out to discuss with us further at the workshop!

Thank You