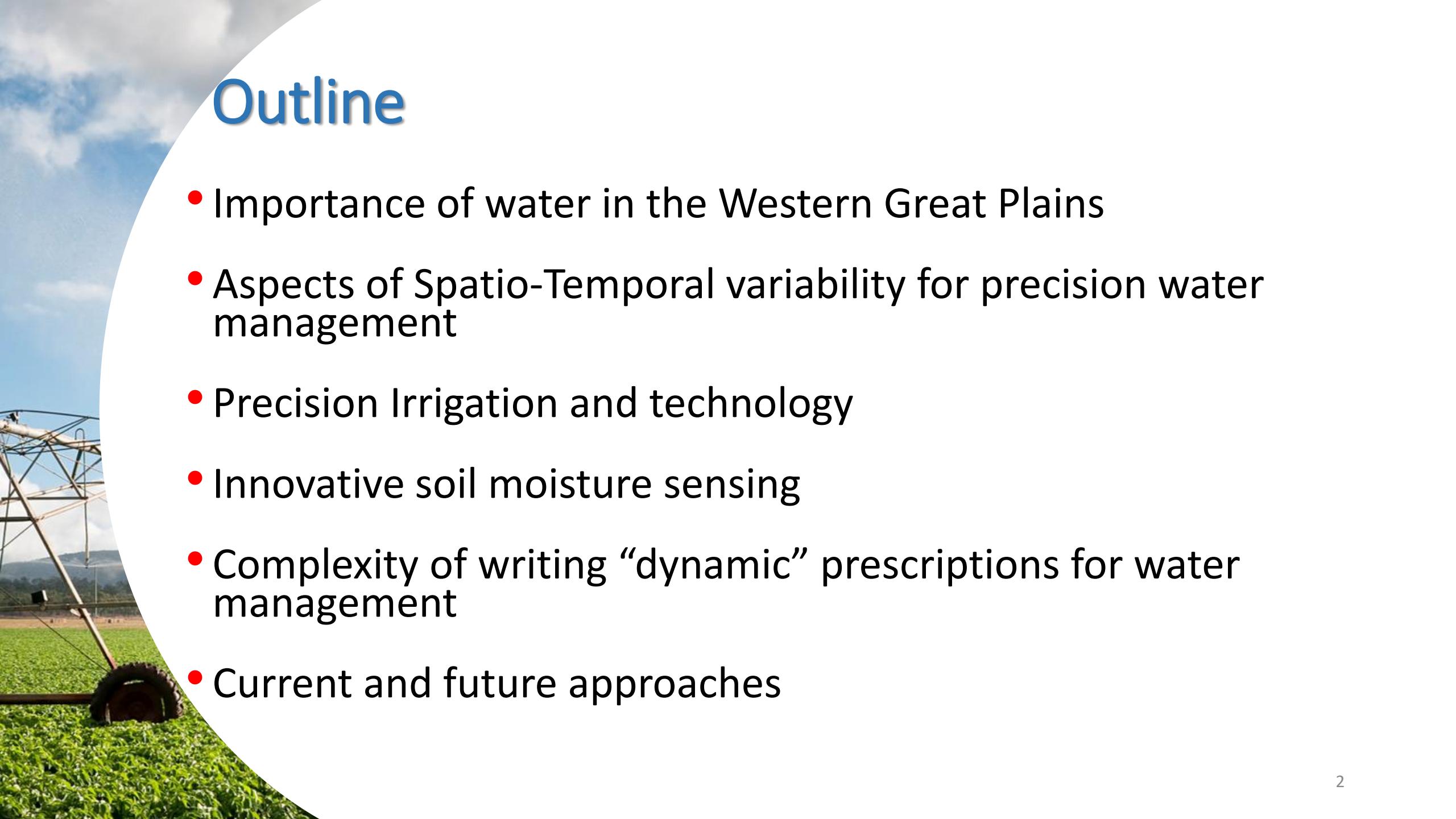




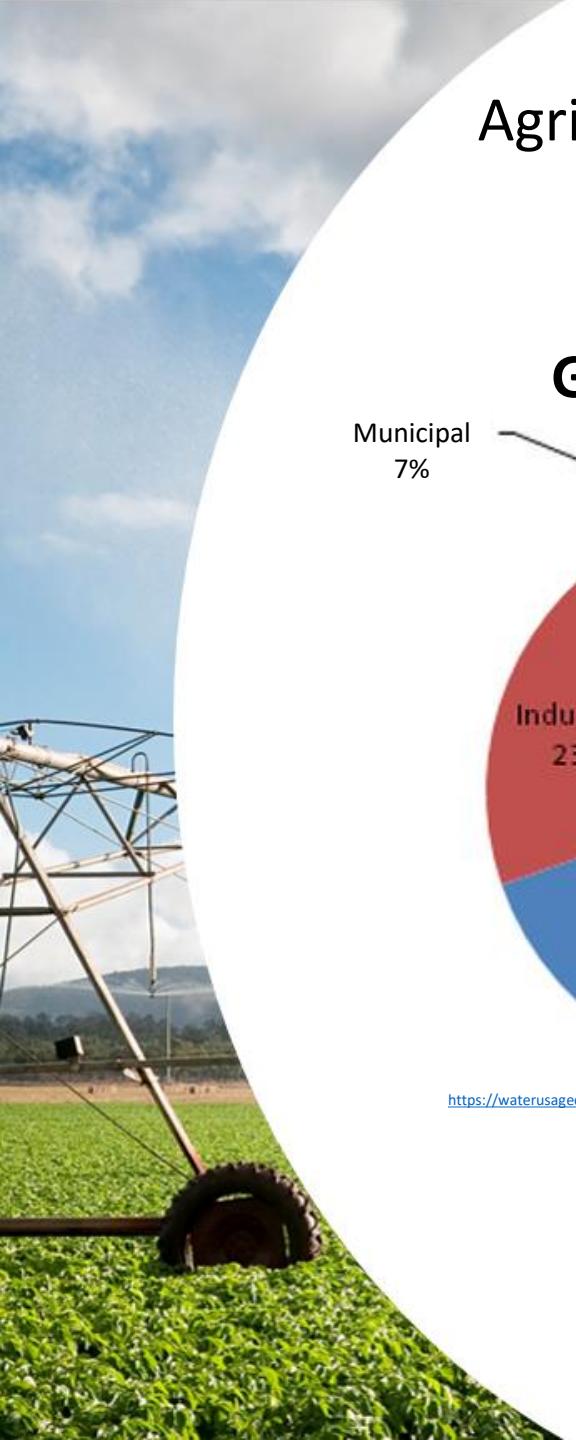
# Precision Water Management in Western Great Plains irrigated agriculture

Dr. Raj Khosla, Professor of Precision Agriculture  
Colorado State University

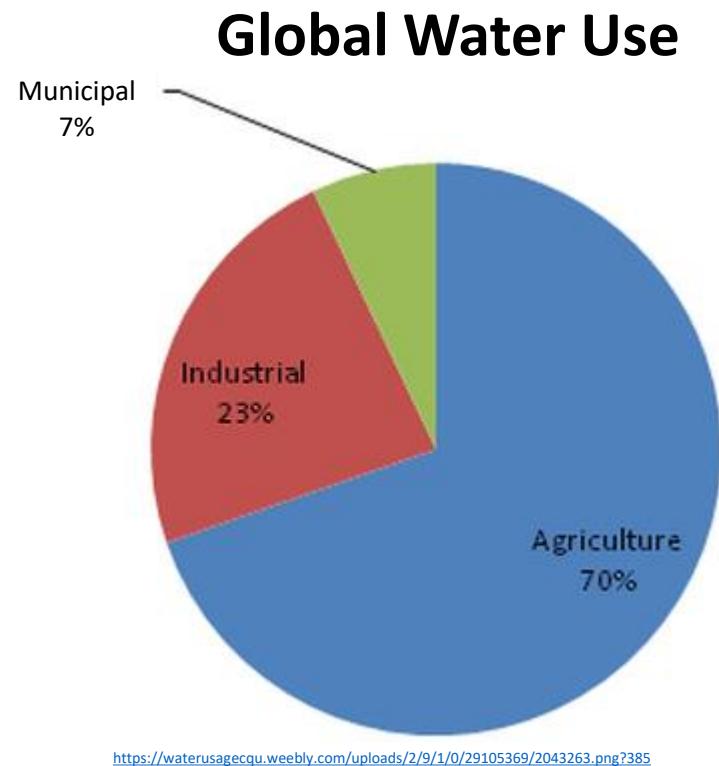


# Outline

- Importance of water in the Western Great Plains
- Aspects of Spatio-Temporal variability for precision water management
- Precision Irrigation and technology
- Innovative soil moisture sensing
- Complexity of writing “dynamic” prescriptions for water management
- Current and future approaches



Agriculture... largest consumer of fresh water...

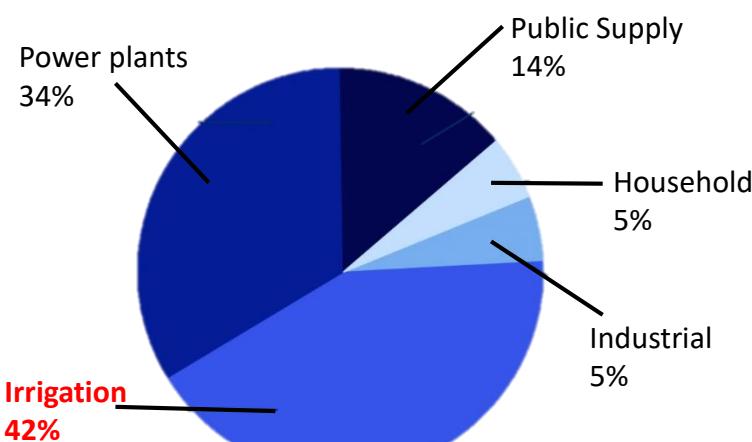


<https://cdn.thefencepost.com/wp-content/uploads/sites/12/2016/09/WaterAg-RFP-012014.jpg>



[https://www.ers.usda.gov/media/9165/june17\\_datafeature\\_schaible\\_photo.jpg](https://www.ers.usda.gov/media/9165/june17_datafeature_schaible_photo.jpg)

# Top U.S. Freshwater Use



- Public supply
- Power plants
- Irrigation
- Industrial
- Aquaculture

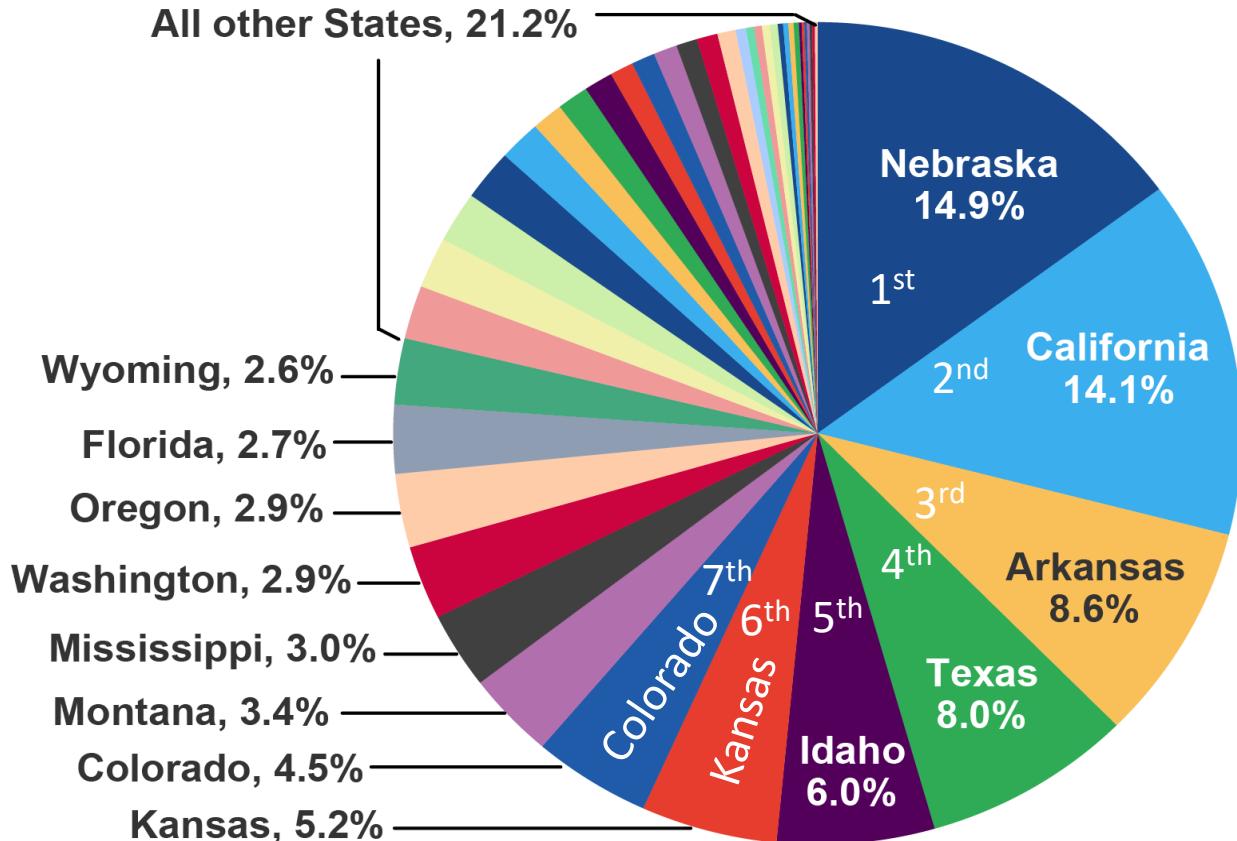
CLIMATE CENTRAL



# The 17 Western States

Source: USDA, Economic Research Service using USDA, National Agricultural Statistics Service, 2012 Census of Agriculture.

Source: USDA, Economic Research Service using USDA, National Agricultural Statistics Service, 2012 *Census of Agriculture*, State data.



Note: The 13 leading States (10 Western, and Arkansas, Mississippi, and Florida) accounted for 78.8 percent of U.S. irrigated acres, including harvested cropland, pasture, and other lands (but excluding horticulture under protection).



# How do we use water in Colorado?

# Water Is Leaving Colorado Farmland For The City – But Will It Ever Return?

By LUKE RUNYON, MATT BLOOM & ESTHER HONIG • JUN 13, 2018

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Tweet  
Email



An old water cliché tells us that "water flows uphill, money." It's an adage born out of people's frustration who benefits when water moves around in the West, popularized by author Marc Reisner's 1986 book, *Desert*.

**Water squeeze  
Fort Collins cuts irrigation to farmers**

With the city of Fort Collins' water resources expected to be extremely stressed next summer, farmers in the 111-year-old Wellington-based Northern Poudre Irrigation Company expect to be the first to be left high and dry.

"The horrible thing is that when Fort Collins was here buying up all these shares, they told us this water would always be available (for lease)," said one east Larimer County farmer, who wished to remain anonymous. "I didn't sell anything to the city, but that's what they told neighbors to reassure us all."

The city owns about 35 percent of the NPIC shares, and much of that water comes from the Colorado Big Thompson Project (CBT), a source the city is seeking to conserve. On average the amount in this former farmers' cooperative constitutes about 25 percent of the company's overall available water, said NPIC Operations Manager Steve Smith.

"I think the farmers, if they are astute about this situation, — given the astute — they will probably cut back on the number of acres they are irrigating," Smith said. He said there really aren't any options for water users in the NPIC service area, which lies between the foothills and the Weld County line, north from the Cache la Poudre River to about Larimer County Road 76.

Other than the water company's rights to natural flow from the Poudre River and

**North Forty News**  
December 2012  
Volume 20 Number 9  
www.northfortynews.com  
The community newspaper for Wellington, north Fort Collins and northern Larimer County, Colorado

**Moose in the morning**

By Jeff Thomas  
North Forty News

With the rising sun illuminates the hillside behind a moose making its way in the snow near Fort Collins, Colo., about 25 miles northwest of Red Feather Lakes just across the Wyoming border. Photo by Brian Graves. Wellington Toy Storage

**Larimer County reaches out to fire survivors**

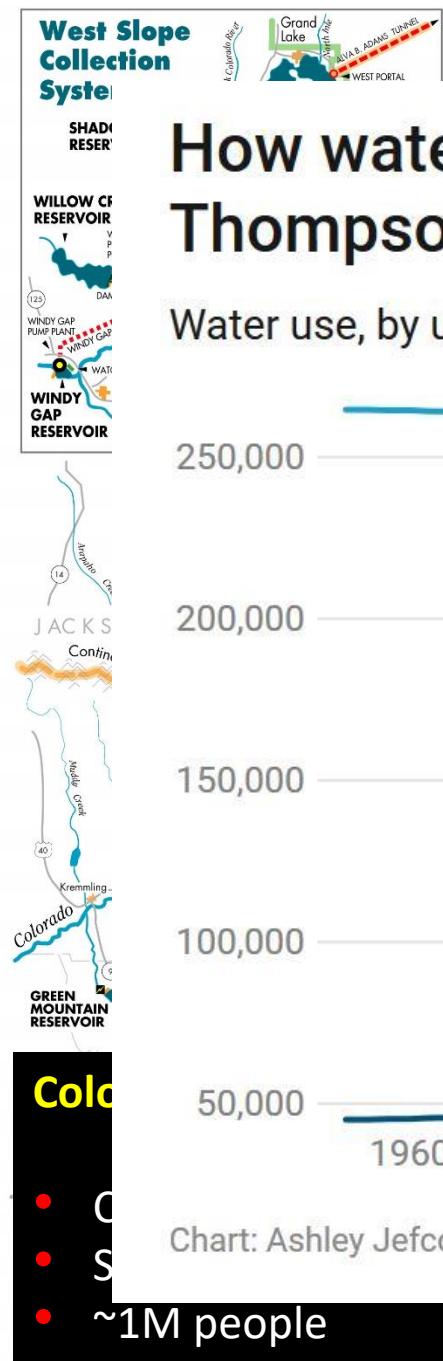
By Kate Hawthorne  
North Forty News

How can you deck the halls if you have no halls — or walls, or roof? You can't go home for the holidays if your home has burnt to the ground, and survivors of this summer's High Park and Woodland Heights fires are feeling anything but jolly this holiday season.

"You can't escape the holiday hype in our culture," said Neil Rosenthal, a Boulder-based therapist who has lost two homes to mountain wildfires. "You're supposed to be happy and joyous and

from that ideal."

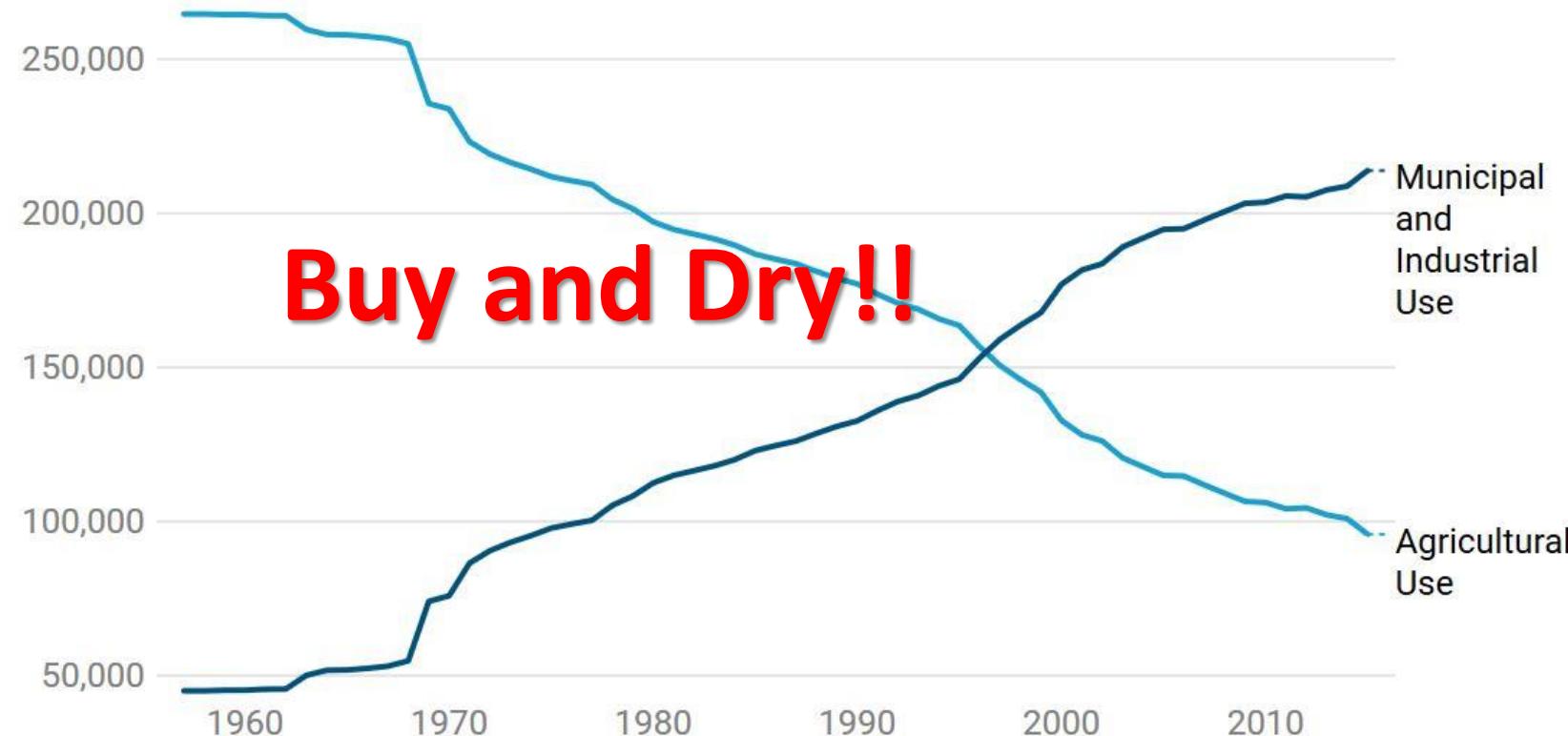
Rosenthal presented a workshop in Fort Collins in October for fire survivors on how to heal. He said the reality is that people are still working through the loss of their homes and everything but them, and the overwhelming feelings of emptiness, aloneness and loneliness that ensues. Some are still fighting with their insurance company; some are fighting to



# Northern Colorado

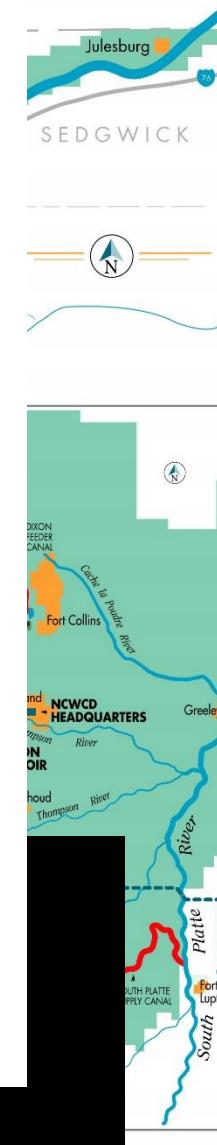
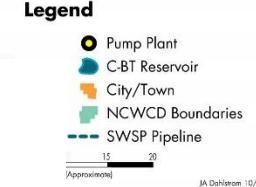
## How water ownership has changed on the Colorado-Big Thompson Project:

Water use, by units of Colorado-Big Thompson water



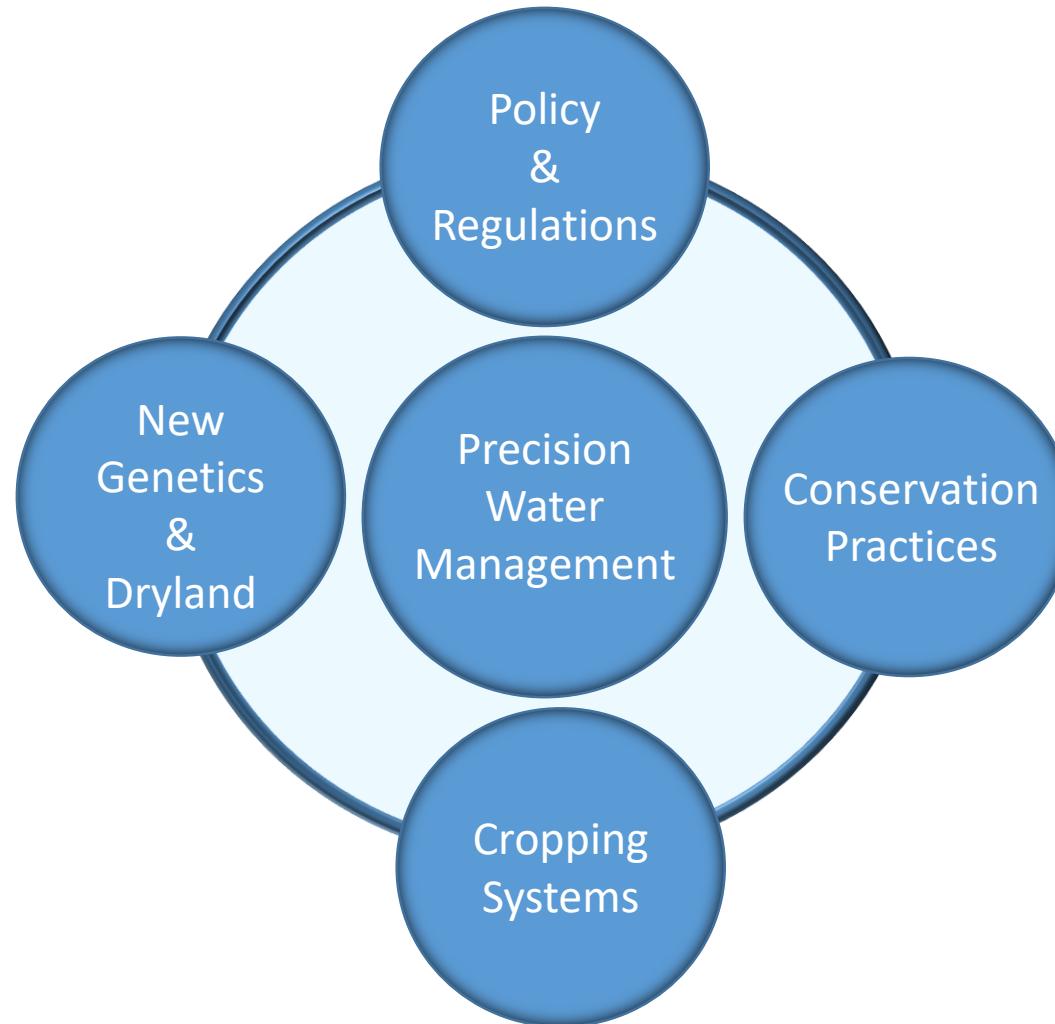
**Buy and Dry!!**

Chart: Ashley Jefcoat/KUNC • Source: Northern Colorado Water Conservancy Project • Created with Datawrapper





## Multi-prong approach to Water management in the Western Great Plains.



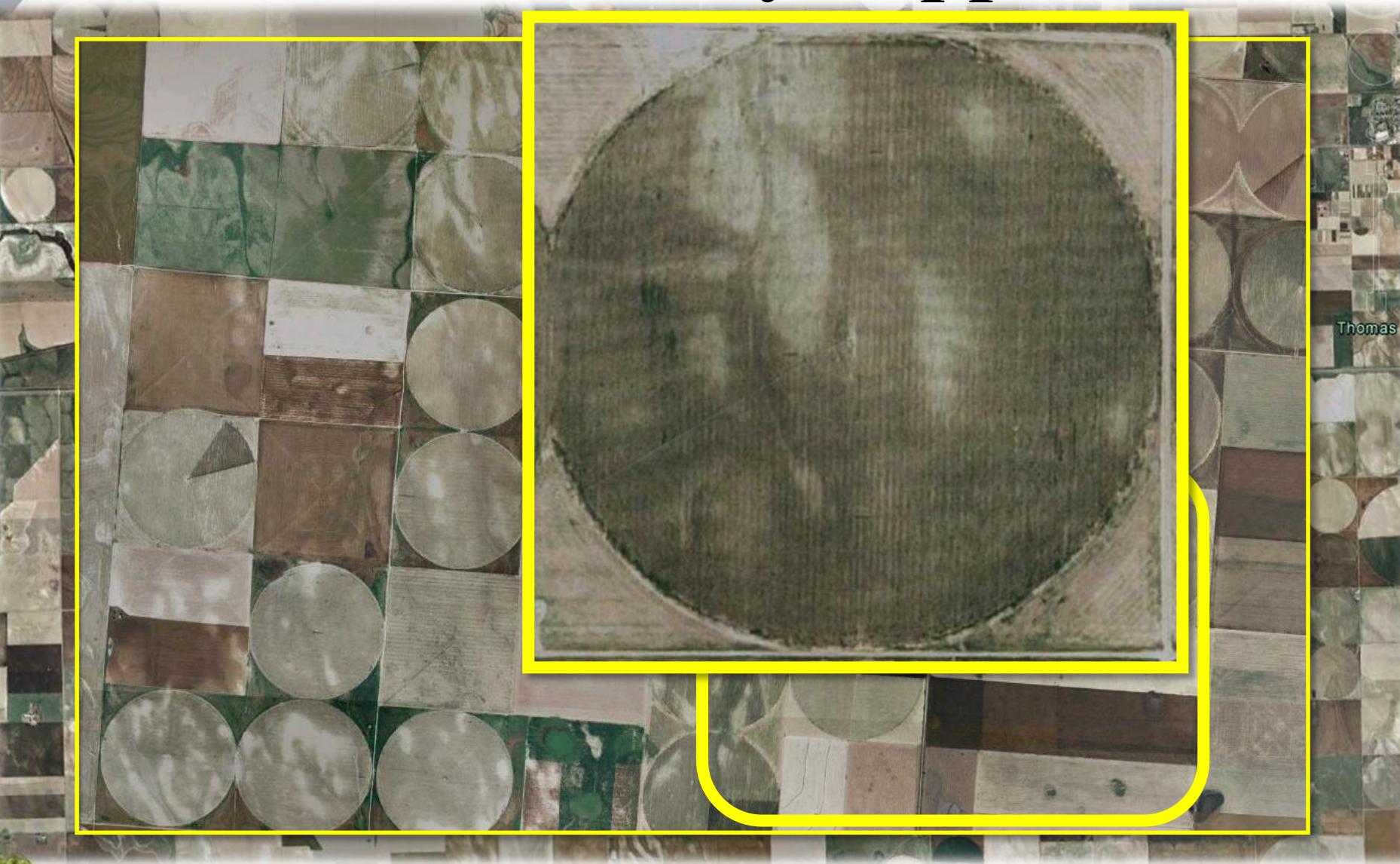


# Five R's of Precision Water Management

- Use of Right Input - Water
- At the Right Time
- In the Right Amount
- At the Right Place
- In the Right Manner

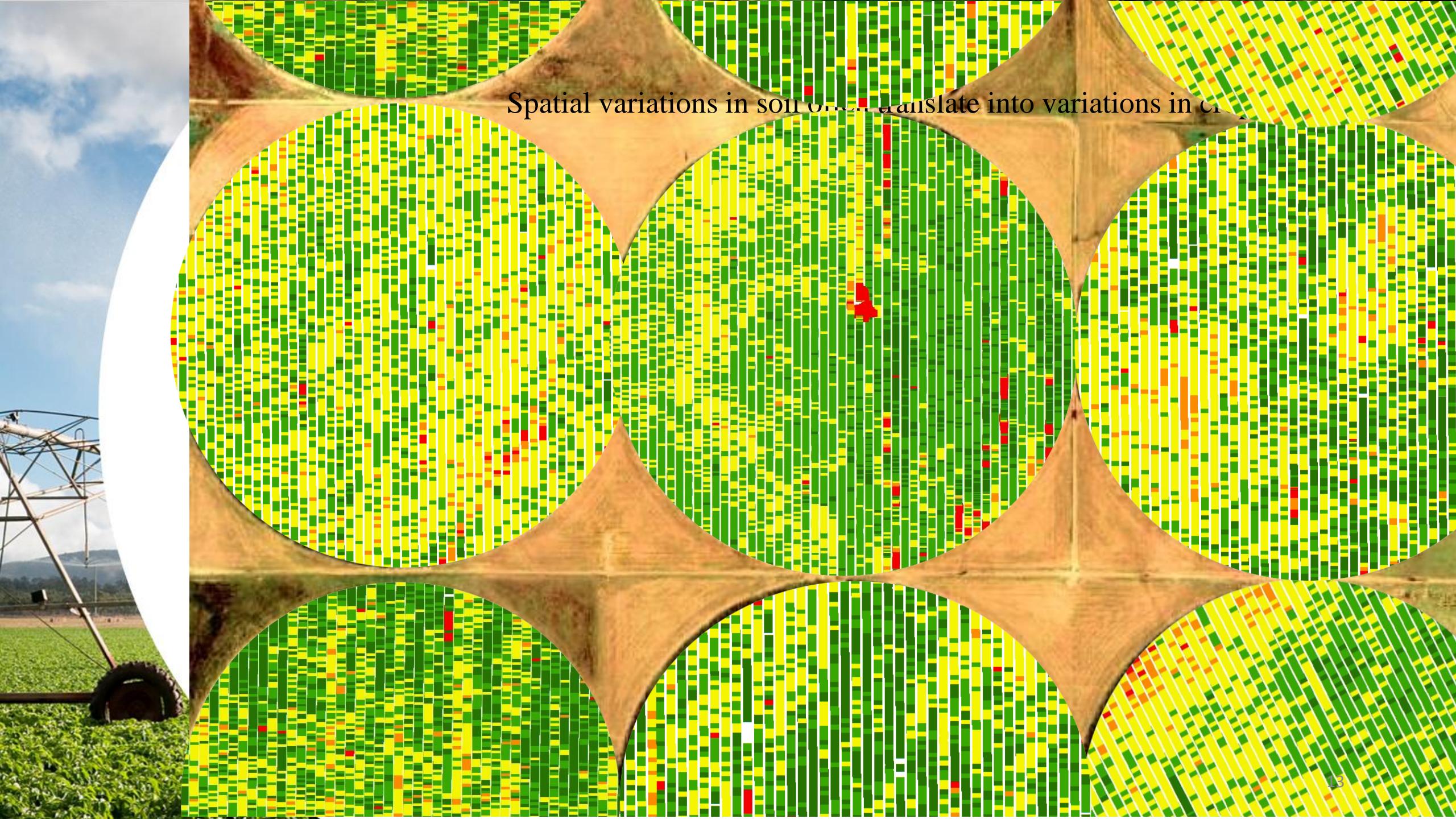
managing **spatial** and **temporal** variability  
in plant available water in farm-fields

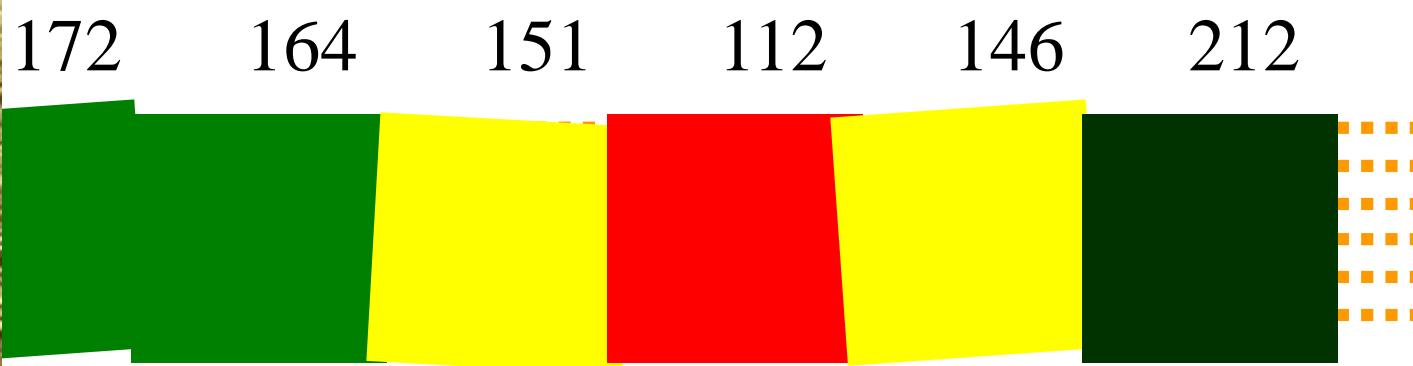
# Variability happens!!



At the **farm** scale

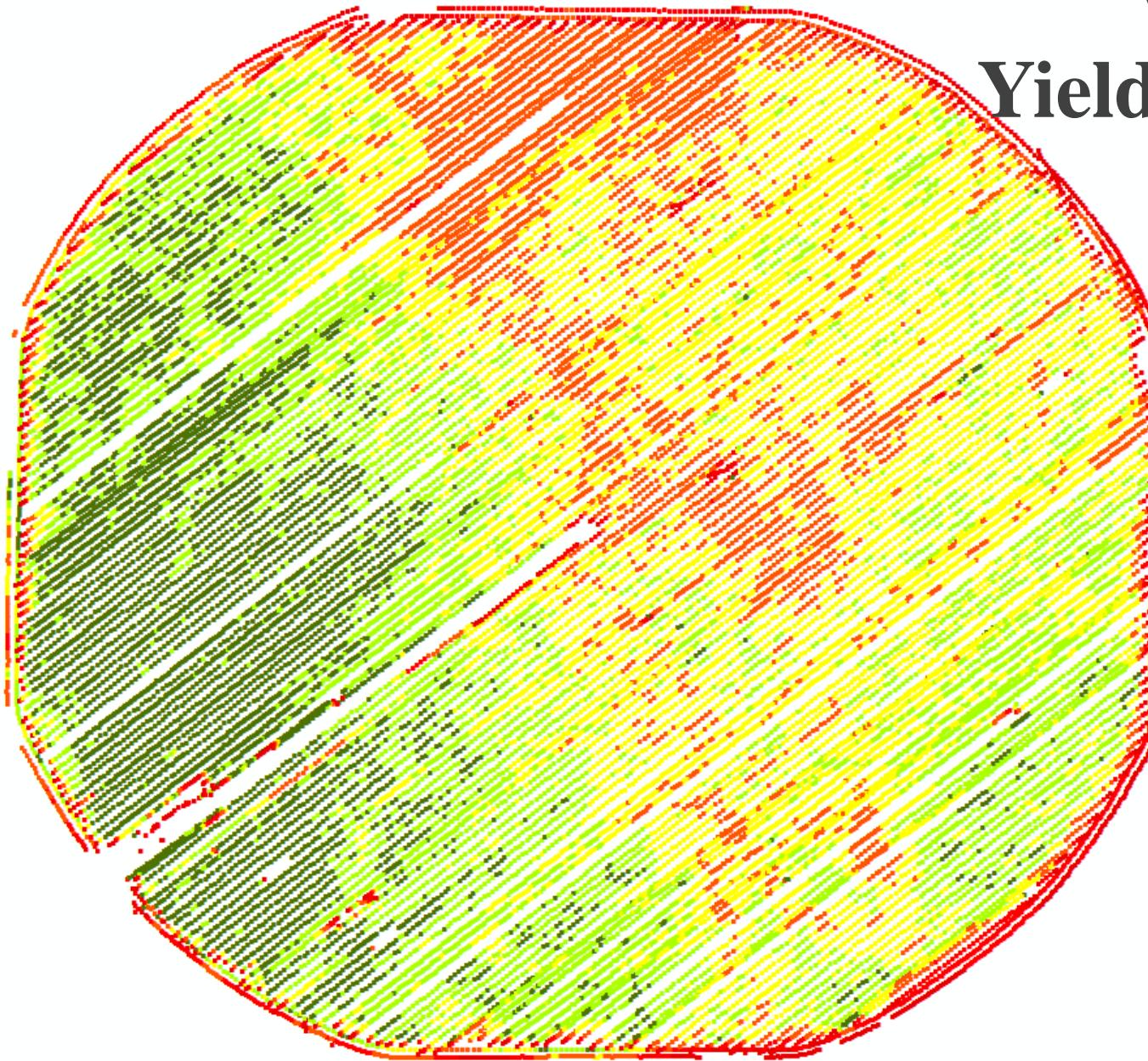
At the **field** scale







# Corn Yield Map



# Corn Yield Map

Mean: 179.8 bu/a

<170bu

22% of field

$\pm 5\%$  Mean

over fertilized

41.8%

Field  
YIELDVOL

Statistics:

Count: 33416  
Minimum: 30.004  
Maximum: 298.17  
Sum: 60191  
Mean: 179.84  
Standard Deviation:  
Nulls: 0

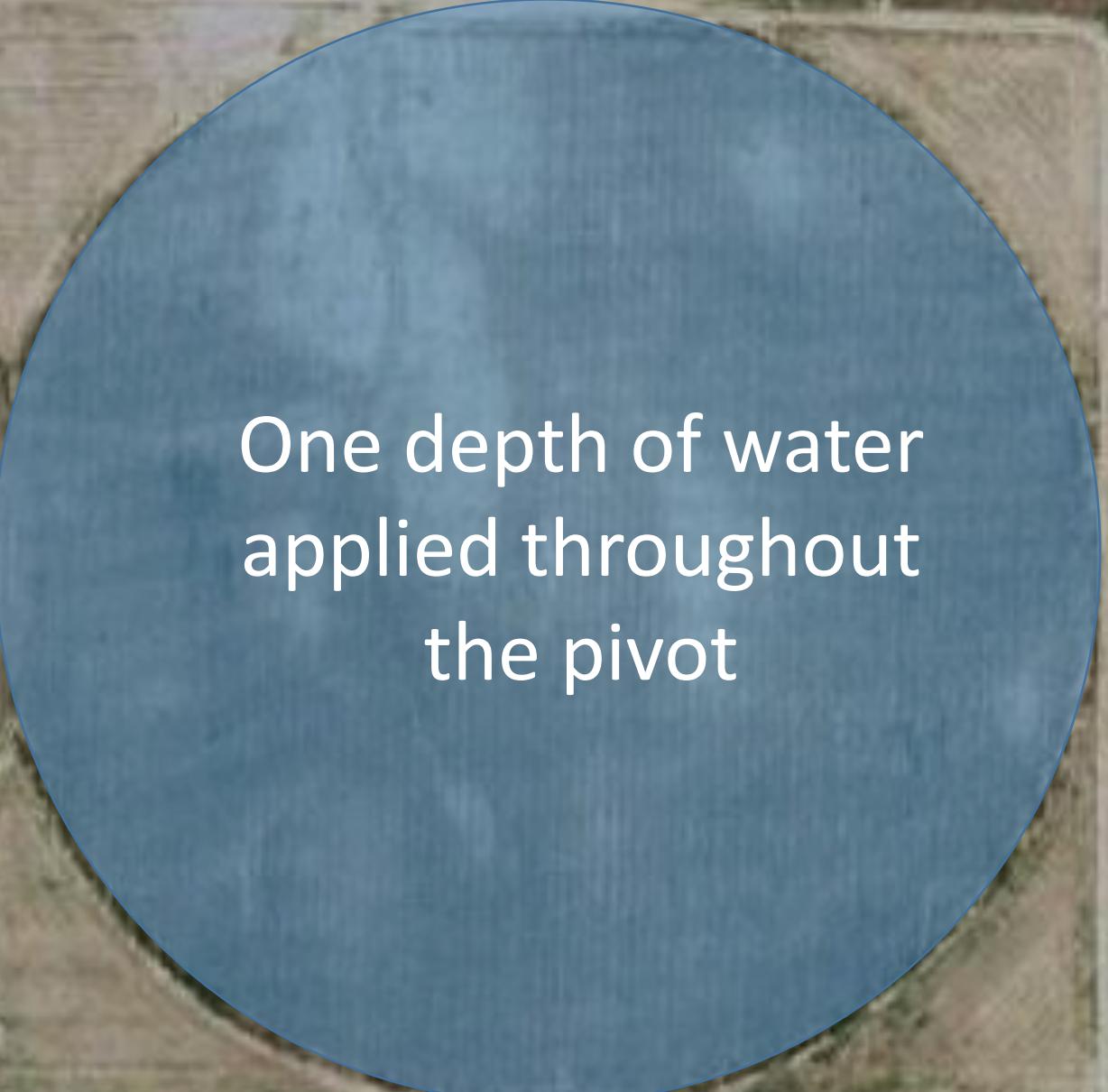
>190bu

35% of field  
under fertilized

Managing variability is  
Key to Precision Agriculture

52.6 97.8 143.0 188.2 233.4 278.6

# Current Water Management



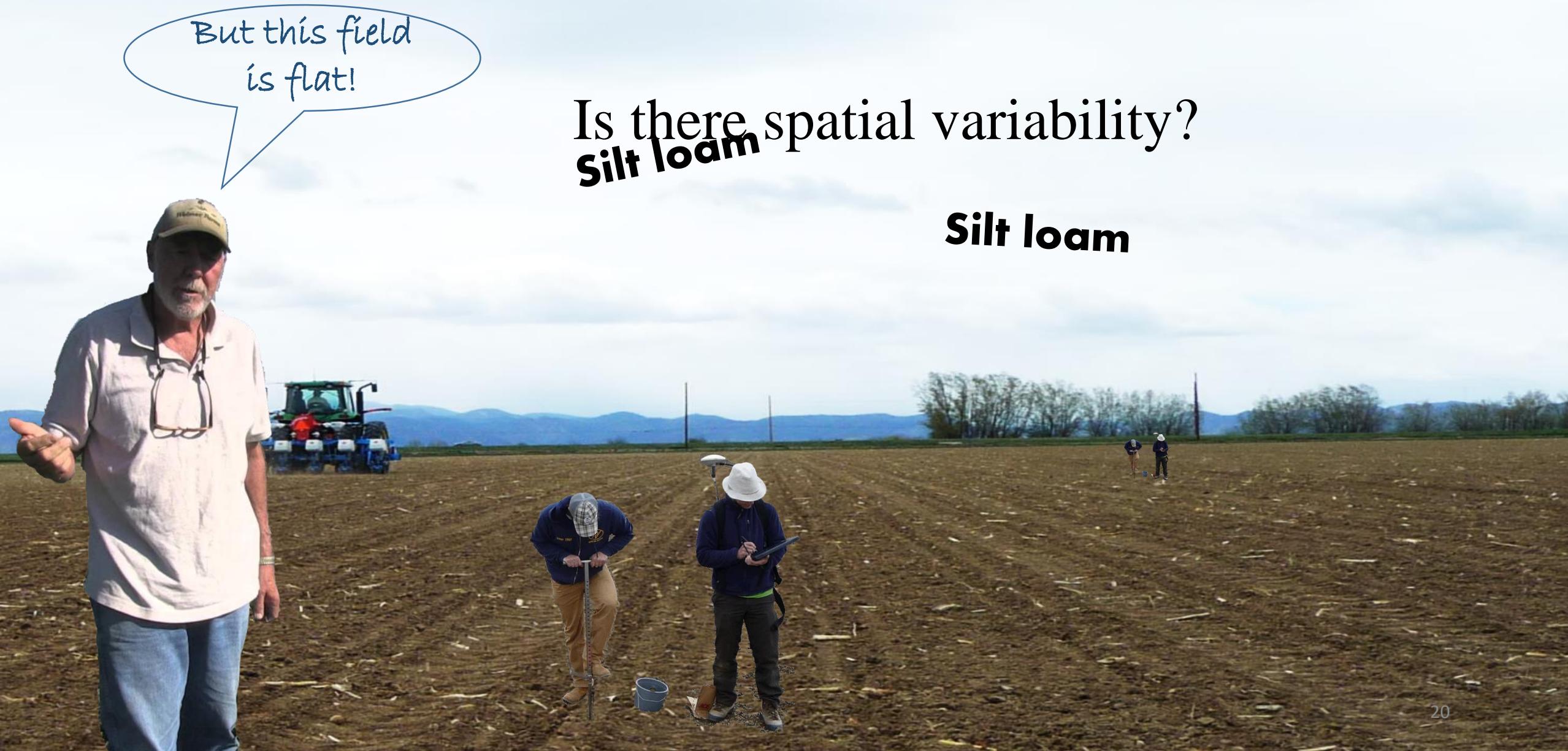
One depth of water  
applied throughout  
the pivot



A wide-angle photograph of a lush green field, likely wheat or barley, stretching to a distant horizon under a vast, clear blue sky. The lighting suggests either early morning or late afternoon, with soft, warm light on the horizon.

No variability?

# Precision Water Management





Sample A

Sand: 39%

~~silt loam~~  
Silt: 55%

Clay: 6%

B

5%

75%

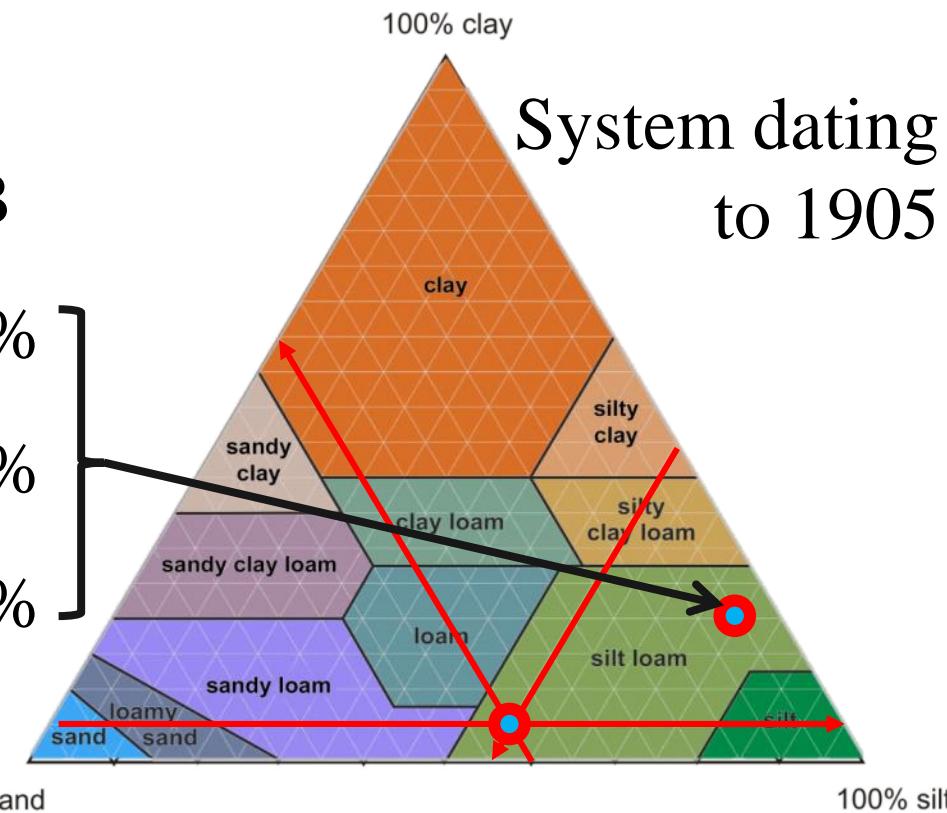
20%

0% sand

100% silt

100% clay

System dating  
to 1905



inches

0

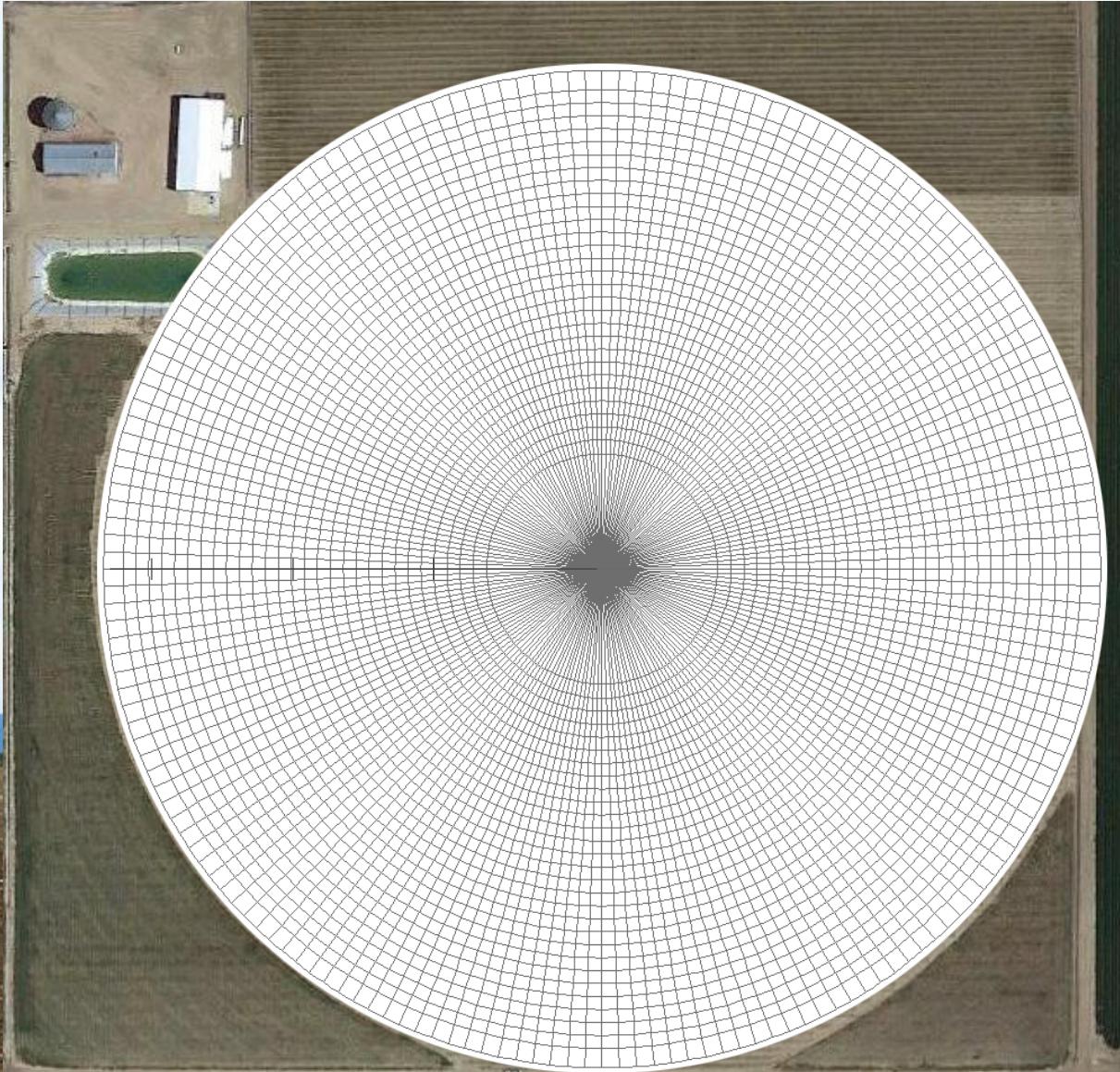
$1/16$

$2/16$

$3/16$

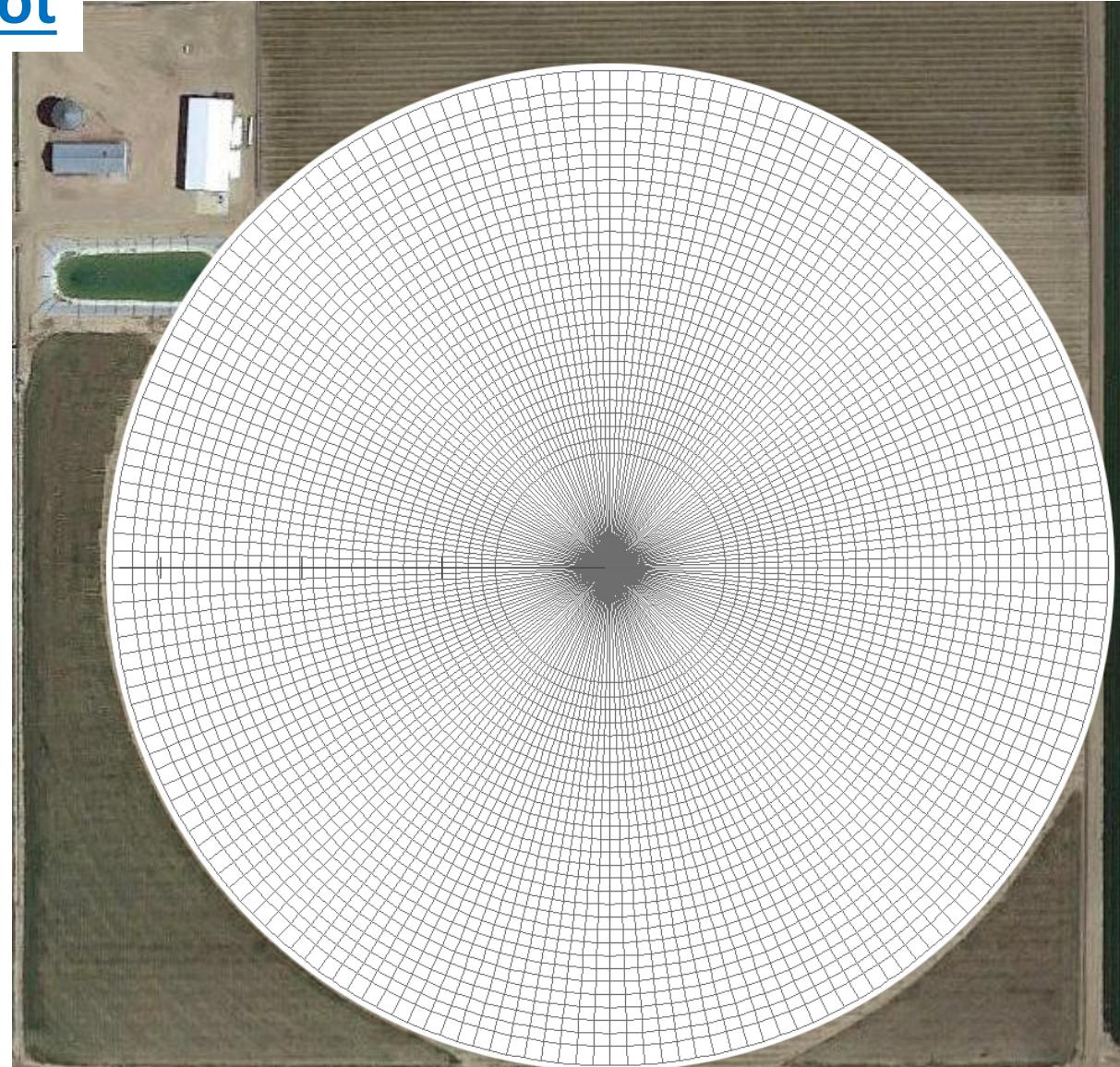
This field is not only flat,  
it is one soil type, and one  
soil texture class!

**Silt loam**

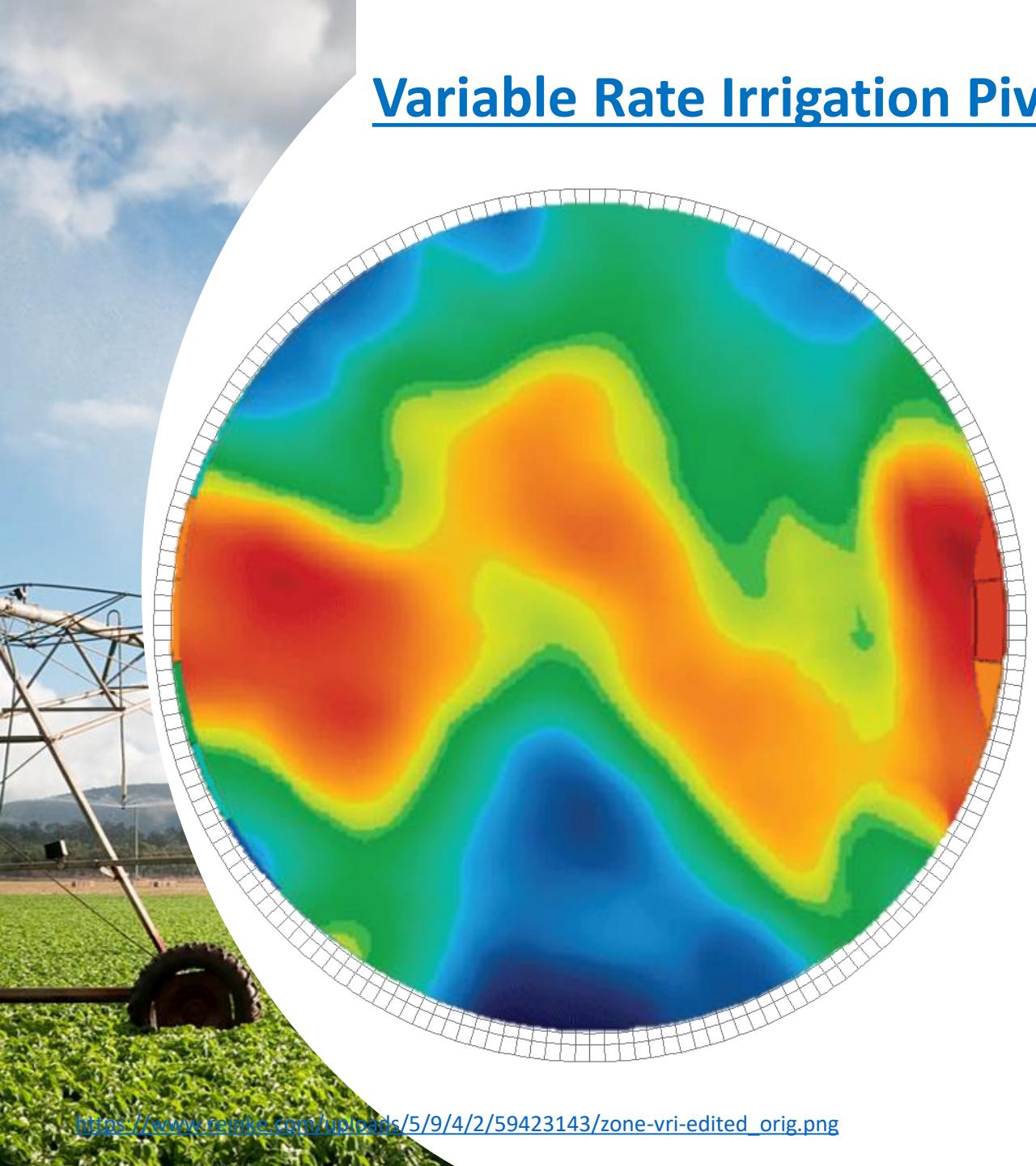


## Variable Rate Irrigation Pivot

- Water can be varied
  - at every nozzle level
  - for every 2° of pivot movement
- $\frac{360^\circ}{2^\circ} = 180^\circ \times 30 \text{ nozzles}$
- = 5400 water management zones
- Technology is ahead of science

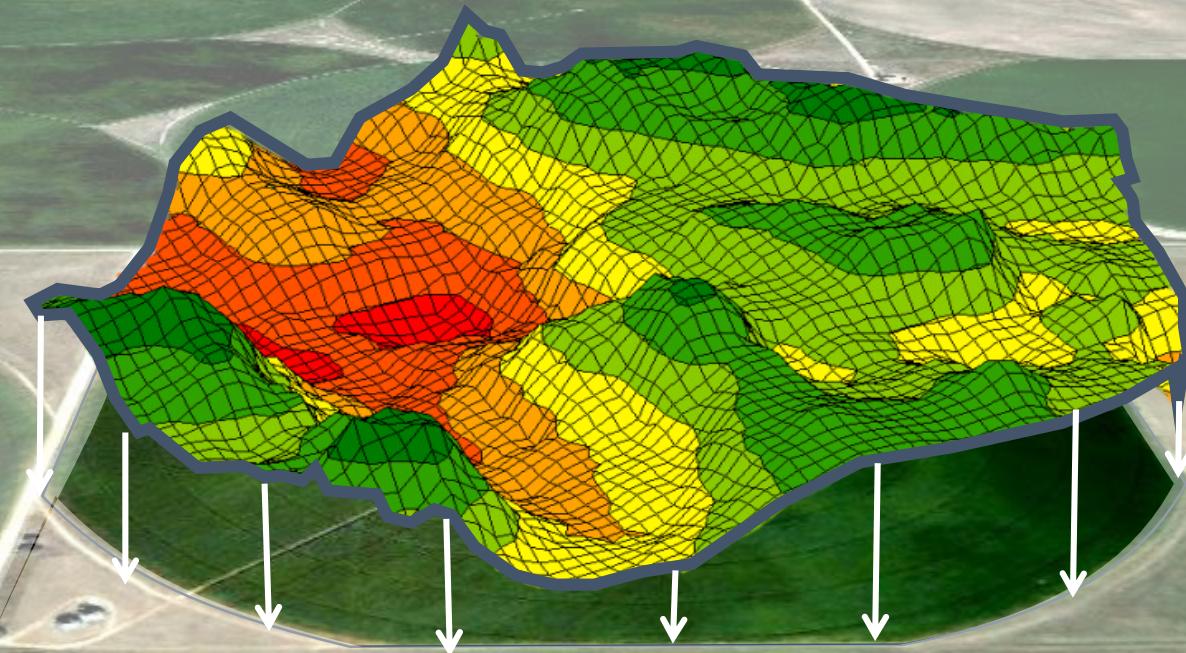


## Variable Rate Irrigation Pivot



- Does it even make sense to apply different rate of water in each zone / pixel?
- How do we figure out how much water to be applied in each zones / pixel?
- How many zones are ideal for my field?
- Do these zones change?
- How much?
- How often?
- What about other parameters?

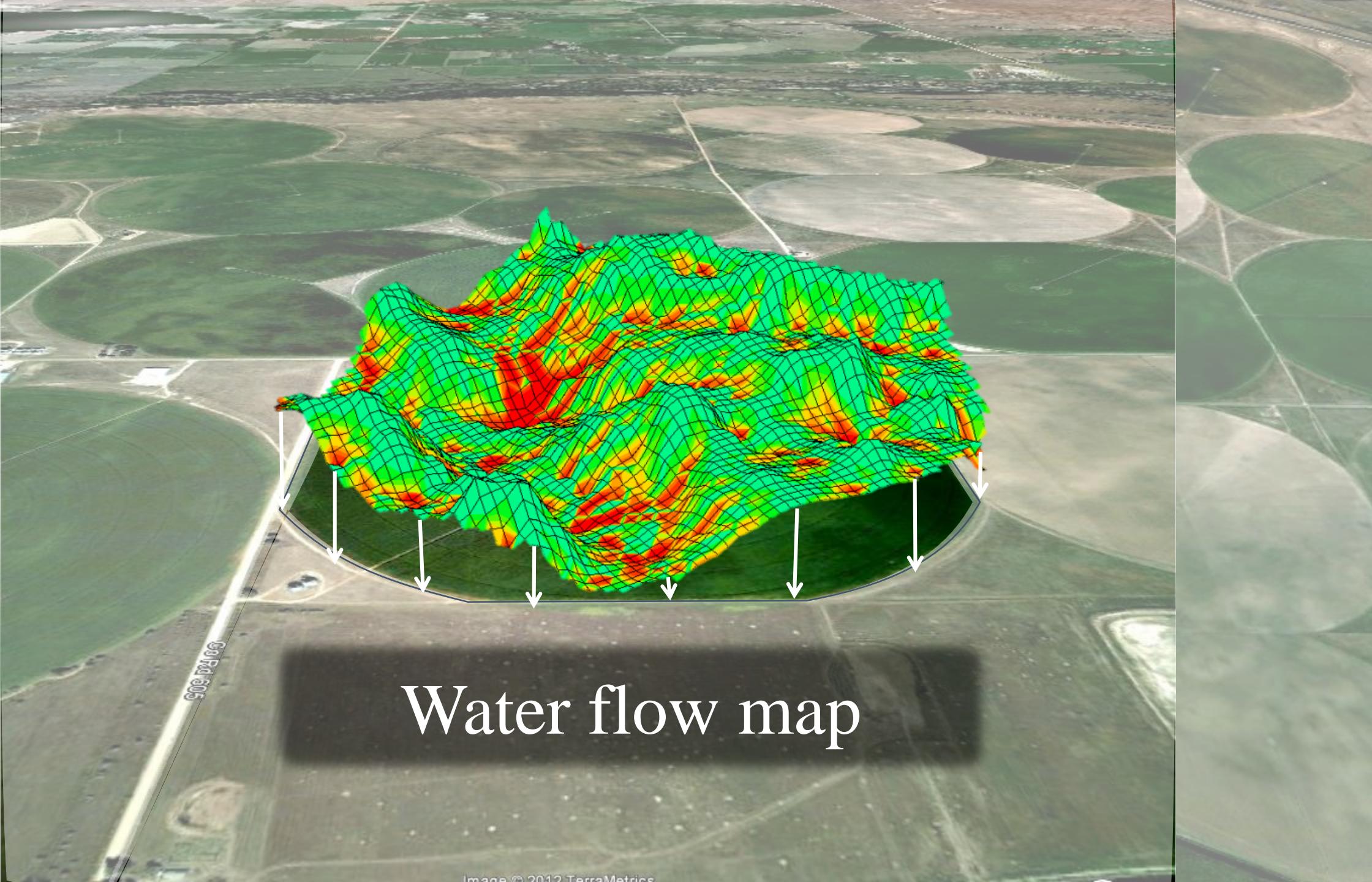
# Field topography

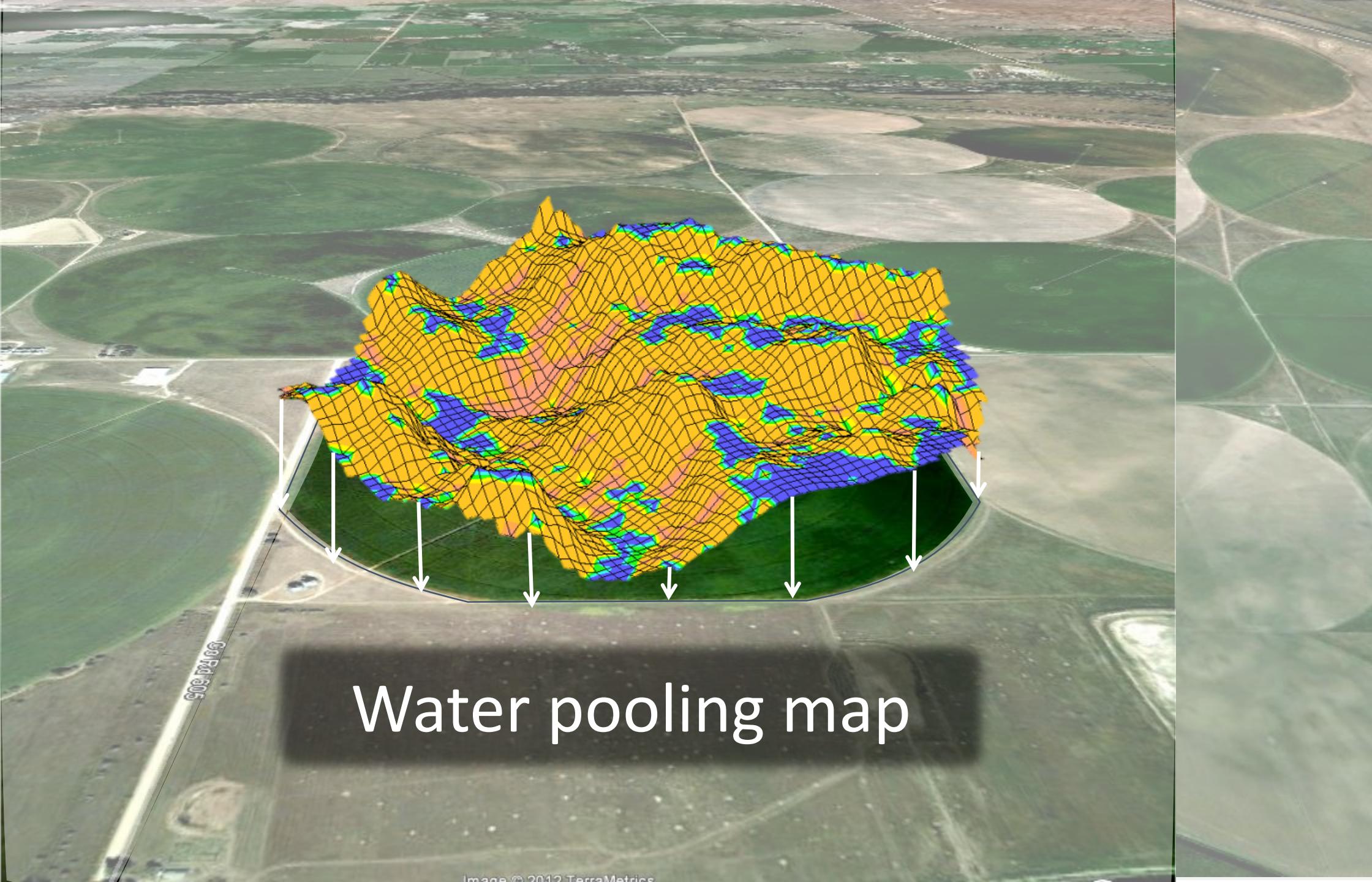


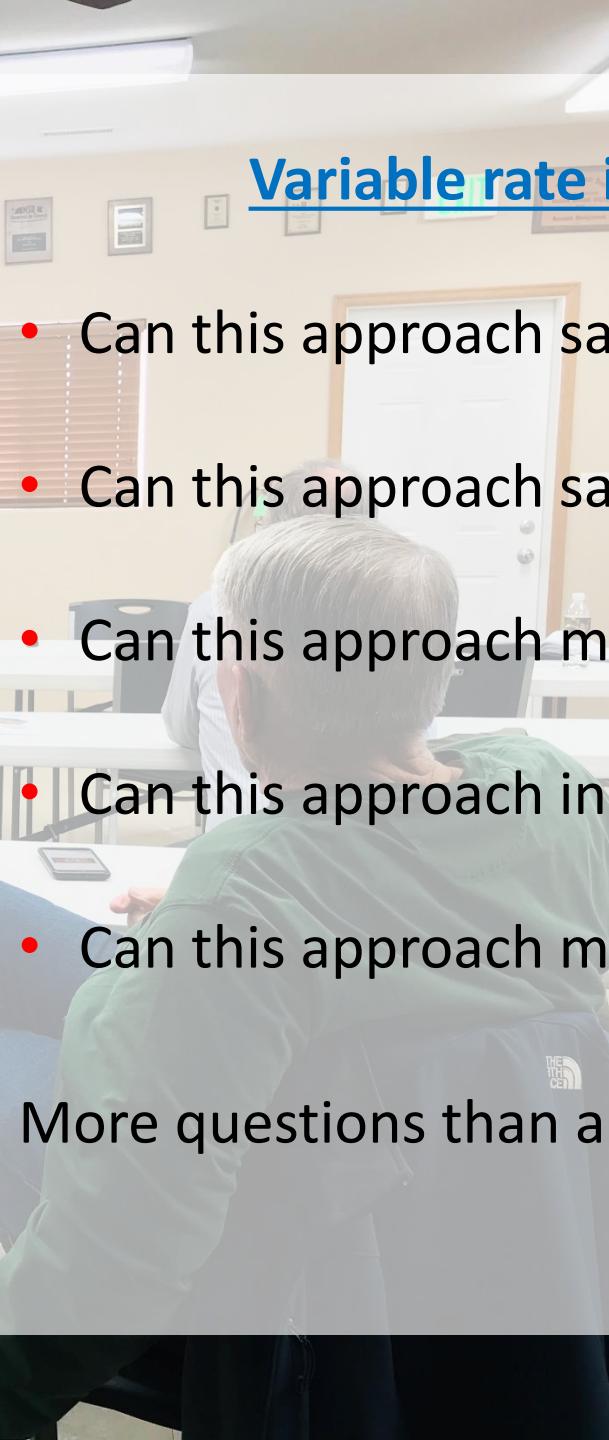
## Elevation map

Grain yields are correlated with topography









## Variable rate irrigation Pivot

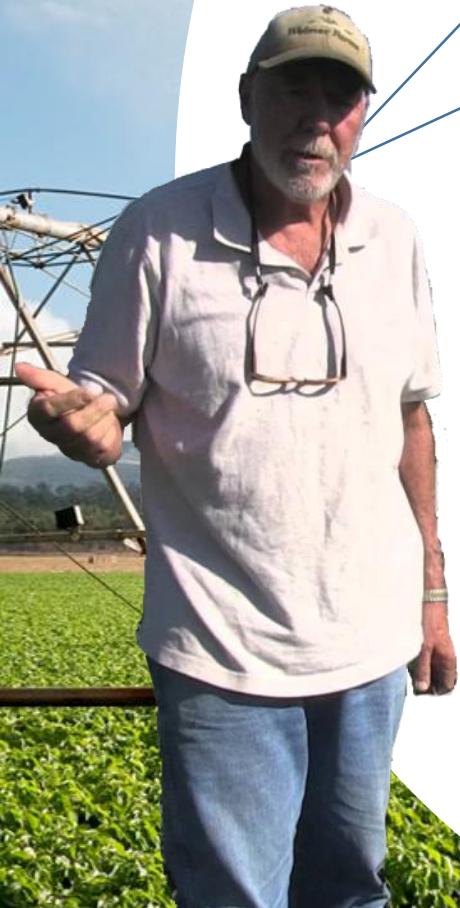
- Can this approach save me any power?
- Can this approach save me any water?
- Can this approach maintain my production?
- Can this approach increase my production?
- Can this approach make me more money?

More questions than answers

**Question.** How do we figure out how much water to be applied in each zones / pixel?

**Answer.** We need to know how much moisture is in soil everywhere in the field

This field is flat, has one soil type, and one soil texture class!

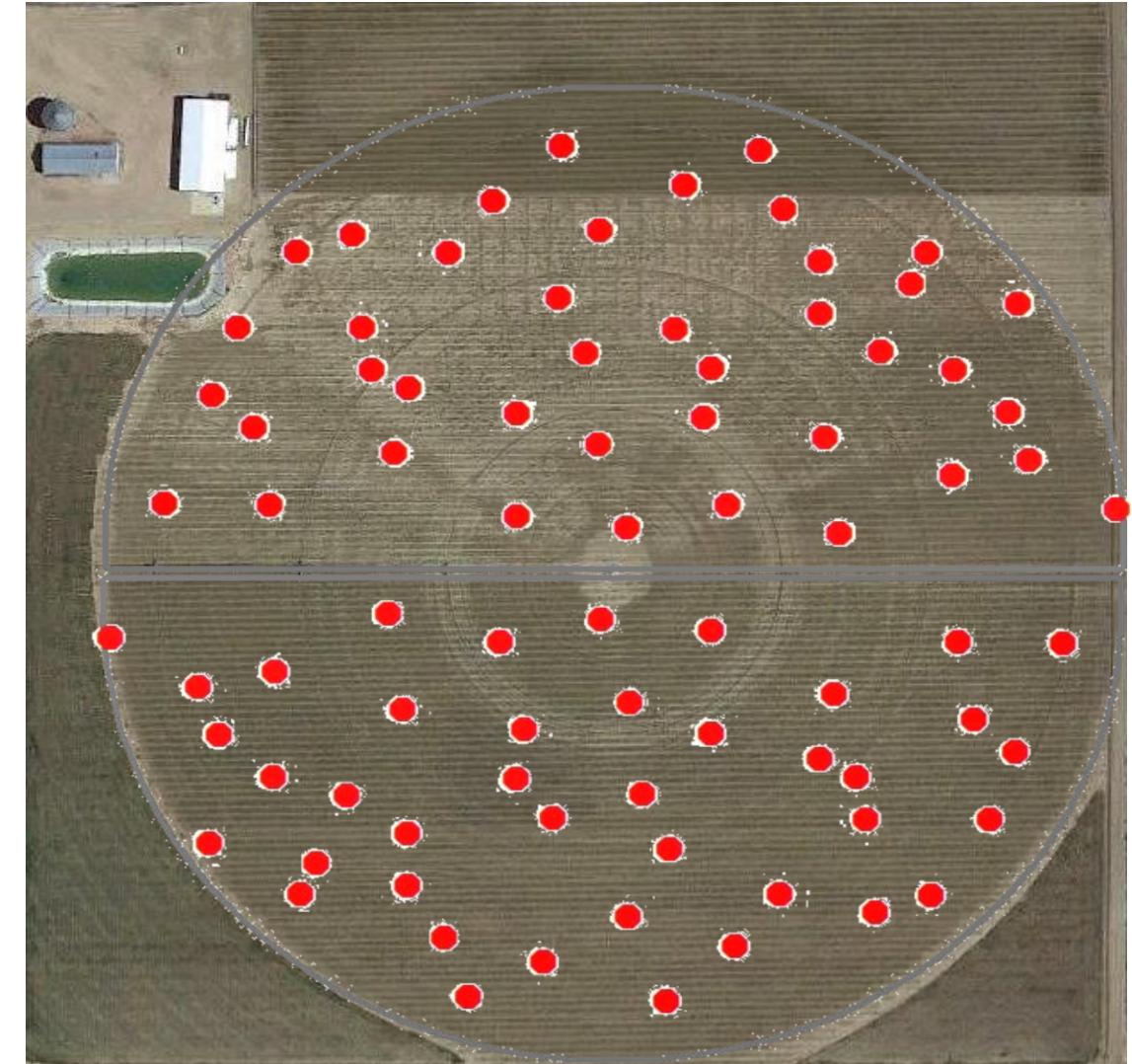


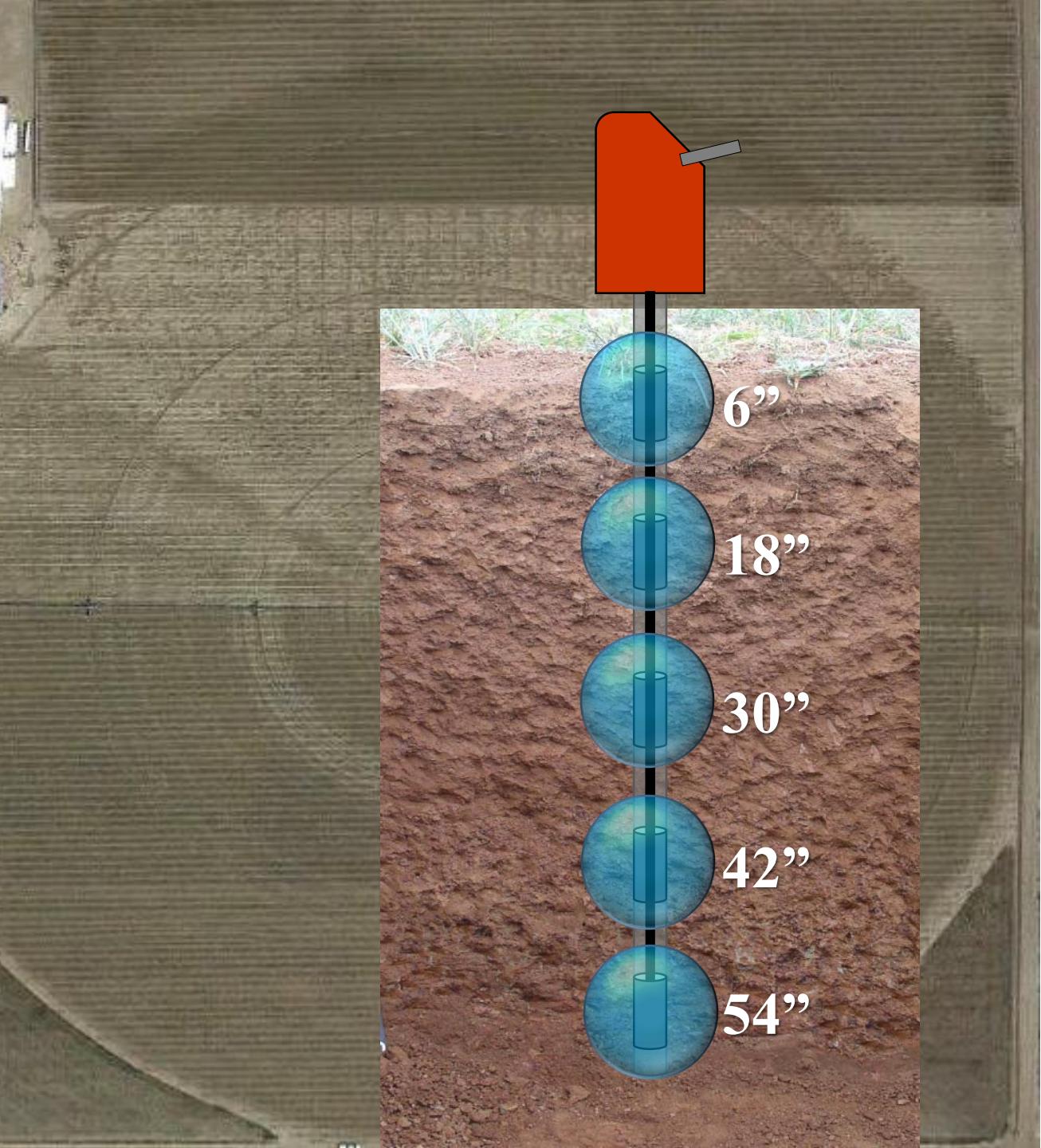
Quest

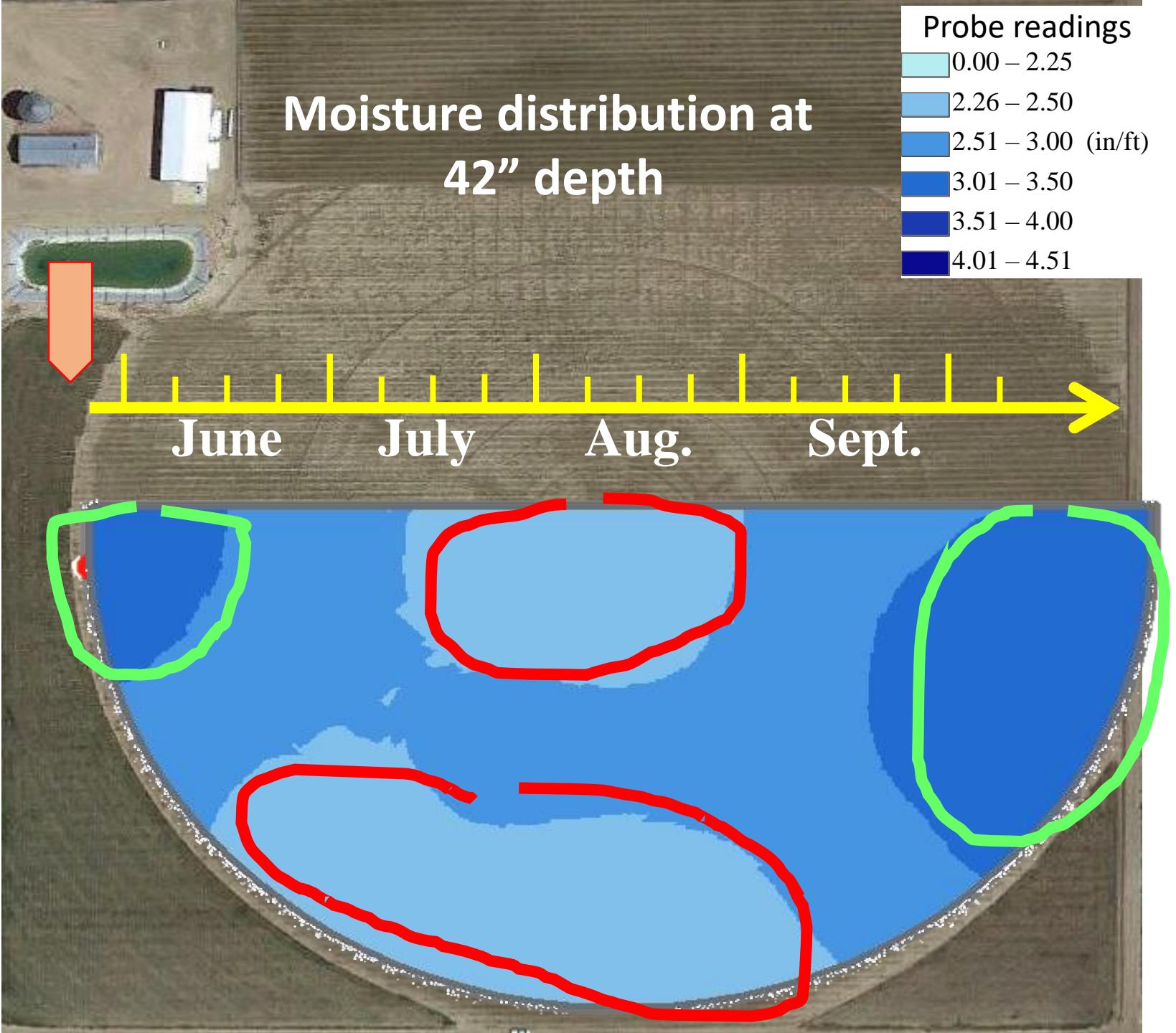
Ans

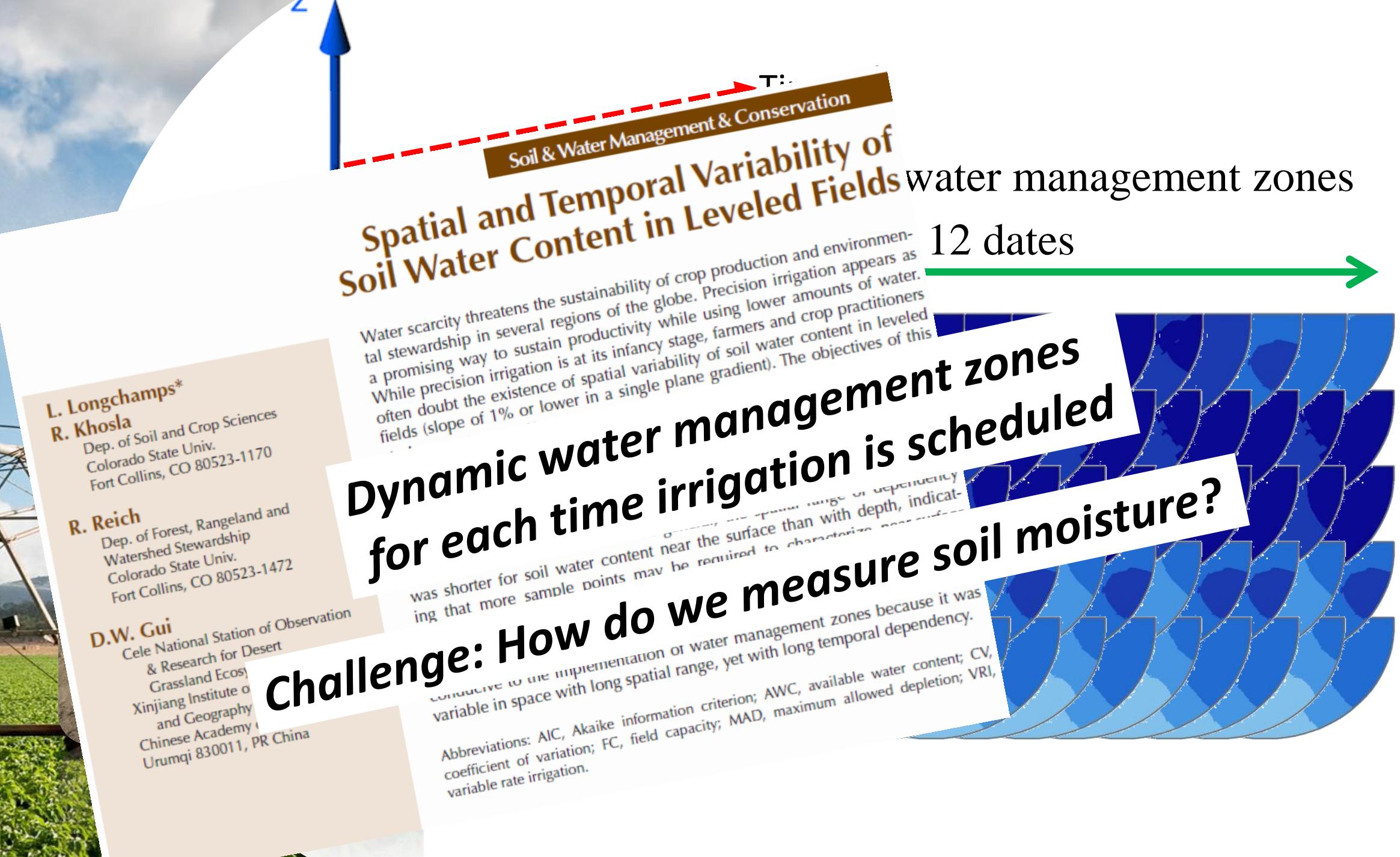
much water to be applied in each zones / pixel?  
moisture is in soil everywhere in the field

Variogram





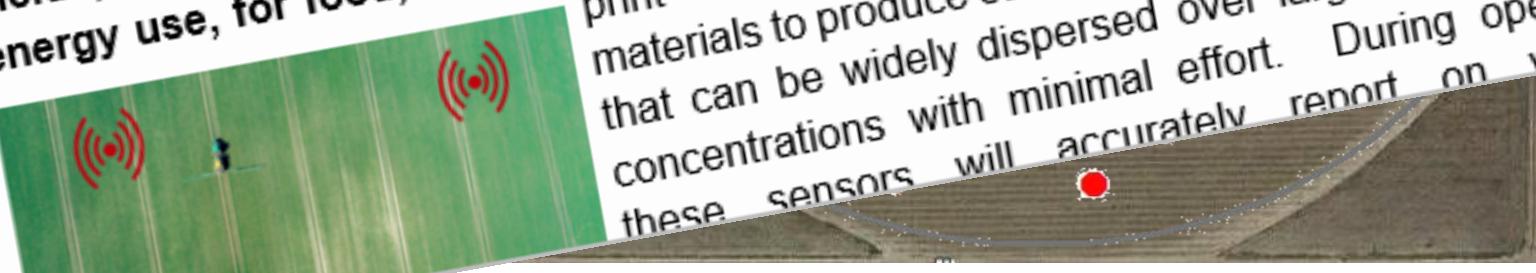




# Precision Agriculture using Networks of Degradable Analytical Sensors (PANDAS)

## 1. SUMMARY

In the propose work, we will develop, fabricate and test a **network of additively fabricated, biodegradable sensor nodes** with costs of **<\$1/unit** capable of accurately and continuously monitoring soil and crop conditions, function an entire season, be easily distributed by planters with no need for ongoing maintenance, and be read remotely. This will enable a **>100x increase in information density** over current solutions for precision farming of row and other crops. This technology would enable characterization of (water, fertilizer, etc.) to crop needs; thereby **enhancing input use efficiency, grain yields, and farm profitability while mitigating environmental losses, and decreasing energy use, for food, feed and fuel crops**. The proposed approach uses large-area print manufacturing techniques and biodegradable materials to produce complete stand-alone sensor nodes that can be widely dispersed over large areas at high concentrations with minimal effort. During operation these sensors will accurately report on various



## In Future



- Cheap
- Easy
- Simple

unding from federal agency is allowing us to develop cheap (<\$1) biodegradable soil moisture sensors



## Sensors Enable Plants to Text Message Farmers

Energy and Environment

NASA Technology

Long-term human spaceflight means long-term menu planning. Since every pound of cargo comes with a steep price tag, NASA has long researched technologies and techniques to allow astronauts to grow their own food, both on the journey and in some cases at their destination. Sustainable food technologies designed for space have resulted in spinoffs that improve the nutrition, safety, and durability of food on Earth.

There are of course tradeoffs involved in making astronauts part-time farmers. Any time spent tending plants is time that can't be spent elsewhere: collecting data, exploring, performing routine maintenance, or sleeping. And as scarce as time is for astronauts, resources are even more limited. It is highly practical, therefore, to ensure that farming in space is as automated and precise as possible.

Technology Transfer

In the early 2000s, a NASA cooperative agreement for developing hardware for biological experiments in space was made available to Hans Seelig, at the time a PhD student at the University of Colorado Boulder and an employee of BioServe Space Technologies, a nonprofit, NASA-sponsored research partnership center located at the university and at the time connected to the Space Product Development Office at Marshall Space Flight Center. As part of his research, Seelig studied the relationship between plant leaf rigidity and its water content, and whether such data could be directly measured using sensors. "No device was available that could measure leaf thickness continually, so I built a prototype sensor that measured thickness by way of electrical pulses," he says.

Seelig hypothesized that sensor-based watering could eliminate a significant amount of guesswork in farming and free up time and resources that could be applied elsewhere. "Astronauts are not supposed to spend their days weeding, watering, and the like, so we wanted to



By measuring electrical pulses, AgriHouse's sensors can determine several characteristics important to plant health. The sensors can remain attached through wind and rain while leaving the plant unharmed.

Review

## Evapotranspiration Estimation with Remote Sensing and Various Surface Energy Balance Algorithms—A Review



remote sensing

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Center for Space and Remote Sensing Research  
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Received: 7 February 2014; in revised form: 10 April 2014

Published: 28 April 2014

**Abstract:** With the advent of new sensors between Sun, Earth, and space may no longer be limited. Much is known about the magnitude of the energy balance at the Earth's surface, which cannot be directly measured. Basic theories, observational methods, and estimation techniques for estimating evapotranspiration (ET) from surface temperatures, and highlights of the various estimation methods. Although some of the methods have been well developed, we cannot yet estimate ET accurately unless we know the

unless we know the

Academic Editors: George P. Petropoulos and Praveen Kumar  
Received: 7 March 2017; Accepted: 1 May 2017; 1

**Abstract:** California growers face challenges to use the least amount of water while optimizing irrigation management. Irrigation management (ET<sub>irrig</sub>) is a dominant component of crop performance of a remote sensing-based approach with Internalized Calibration (METRIC), in which ET<sub>irrig</sub> is estimated by Landsat satellite observations. Reference crop ET<sub>0</sub> was used for the internal calibration period, instead of alfalfa based reference evapotranspiration (ET<sub>0</sub>) estimates during Landsat overpass



## Evapotranspiration Estimate over an Almond Orchard Using Landsat Satellite Observations

Ruyan He <sup>1,2</sup>, Yufang Jin <sup>2,\*</sup>, Maziar M. Kandelous <sup>3</sup>, Daniele Zaccaria <sup>2</sup>, Blake L. Sanden <sup>4</sup>, Richard L. Snyder <sup>2</sup>, Jinbao Jiang <sup>1</sup> and Jan W. Hopmans <sup>2</sup>

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<sup>2</sup> Department of Land, Air and Water Resources, University of California, Davis, CA 95854, USA; d.zaccaria68@gmail.com (D.Z.); rlsnyder@ucdavis.edu

<sup>3</sup> Department of Crop and Soil Science, Oregon State University, Corvallis, OR 97331, USA; maziar.kandelous@oregonstate.edu

<sup>4</sup> University of California Cooperative Extension, University of California, Davis, CA 95854, USA; maziar.kandelous@oregonstate.edu

\* Correspondence: yujin@ucdavis.edu

Research Article

## Estimation of Crop Evapotranspiration Using Satellite Remote Sensing-Based Vegetation Index

Arturo Reyes-González <sup>1,2</sup>, Jeppe Kjaersgaard <sup>3</sup>, Todd Trooien <sup>1</sup>, Christopher Hay <sup>4</sup>, and Laurent Ahiablame <sup>1</sup>

<sup>1</sup> Department of Agricultural and Biosystems Engineering, South Dakota State University, Brookings, SD, USA

<sup>2</sup> Instituto Nacional de Investigaciones Agrícolas, Forestales y Pecuarias (INIFAP), Blvd. Prof. José Santos Valdez, No. 1200 Pte, Col. Centro, Matamoros, COAH, Mexico

<sup>3</sup> Minnesota Department of Agriculture, St. Paul, MN, USA

<sup>4</sup> Iowa Soybean Association, Ankeny, IA, USA

Correspondence should be addressed to Arturo Reyes-González; reyes.arturo@inifap.gob.mx

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Academic Editor: Jan Friesen

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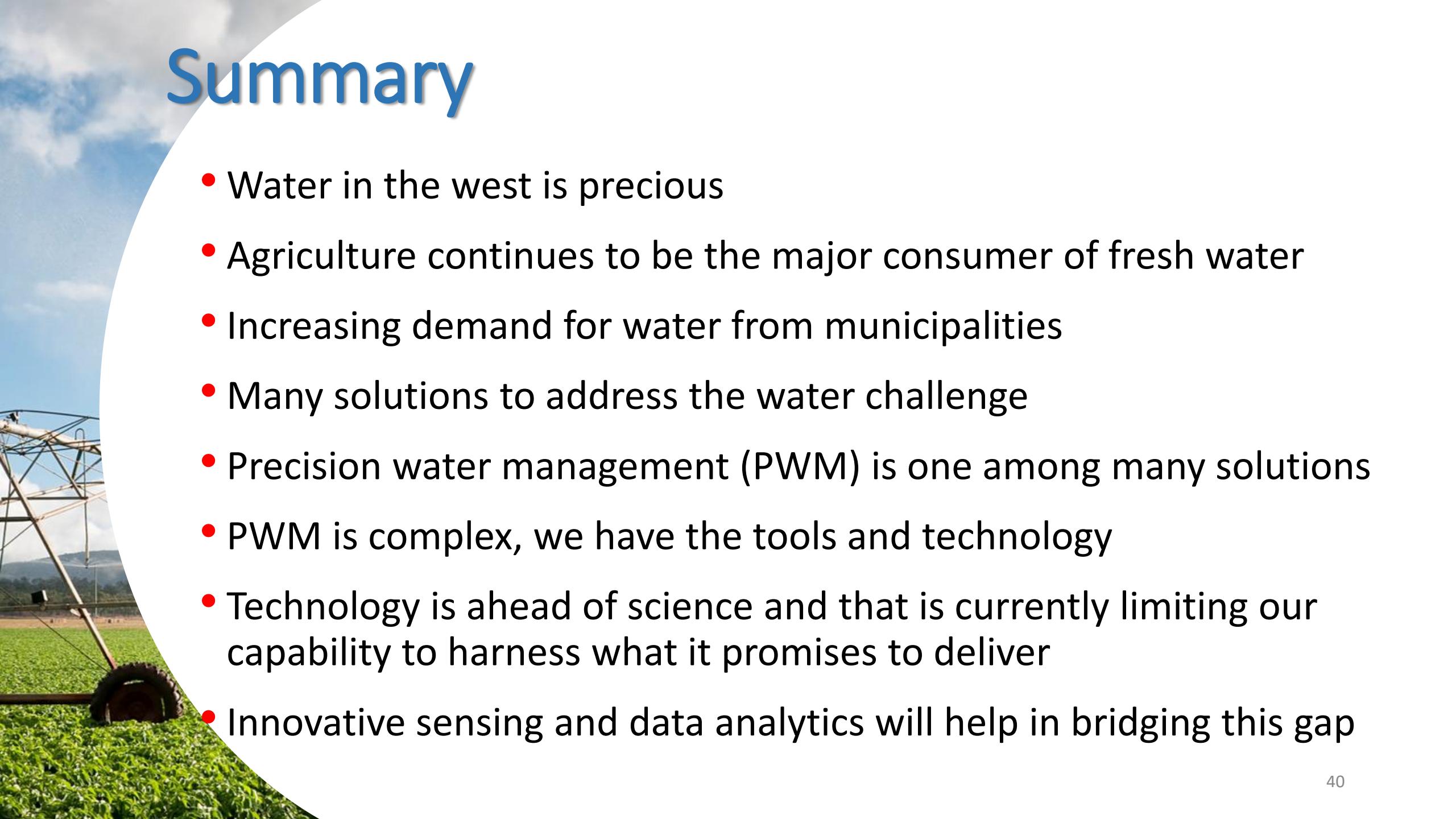
# Calibration Study



- With ability to override

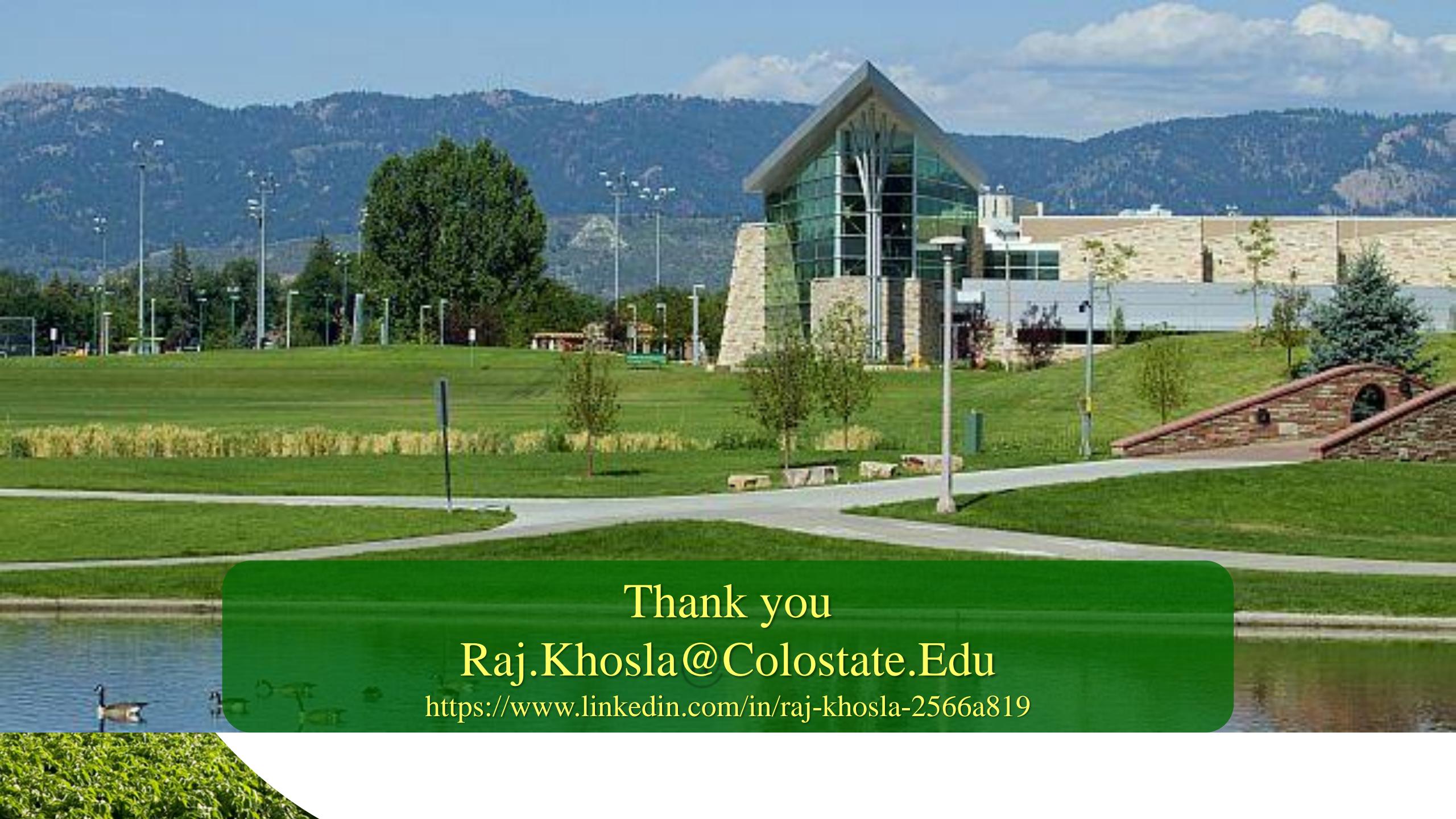
ML = Machine Learning  
AI = Artificial Intelligence





# Summary

- Water in the west is precious
- Agriculture continues to be the major consumer of fresh water
- Increasing demand for water from municipalities
- Many solutions to address the water challenge
- Precision water management (PWM) is one among many solutions
- PWM is complex, we have the tools and technology
- Technology is ahead of science and that is currently limiting our capability to harness what it promises to deliver
- Innovative sensing and data analytics will help in bridging this gap



Thank you  
Raj.Khosla@Colostate.Edu  
<https://www.linkedin.com/in/raj-khosla-2566a819>