

Mapping root-zone
agricultural soil salinity
across scales in
California, USA

GLOBAL SYMPOSIUM ON
**SALT-AFFECTED
SOILS**

20 - 22
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Virtual meeting



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Soil salinity

Salinity refers to the presence of Na^+ , Mg^{2+} , Ca^{2+} , K^+ , Cl^- , SO_4^{2-} , HCO_3^- , NO_3^- , CO_3^{2-} in the soil solution.

Usually measured as electrical conductivity of saturated soil extract (EC_e , dS m^{-1})

Non-saline ($0\text{-}2 \text{ dS m}^{-1}$)

Slightly saline ($2\text{-}4 \text{ dS m}^{-1}$)

Moderately saline ($4\text{-}8 \text{ dS m}^{-1}$)

Strongly saline ($8\text{-}16 \text{ dS m}^{-1}$)

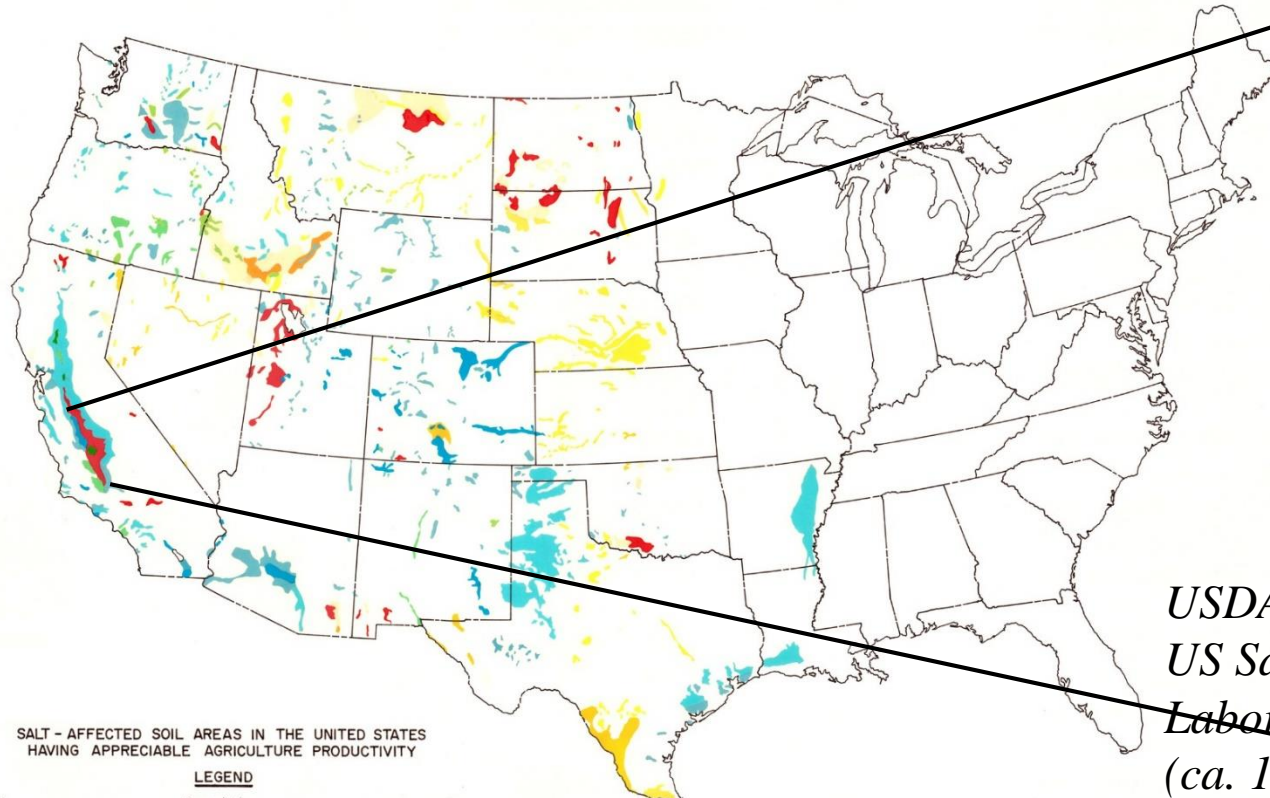
Extremely saline ($>16 \text{ dS m}^{-1}$)

Salinity in the world (ITPS, 2015)

- 1 billion ha of land is salt-affected
- 20% of the ~300 million ha of irrigated **farmland** is estimated to be affected by salinity.
 - >50% found in four countries: China, India, Pakistan, and **United States**



Salinity in the USA

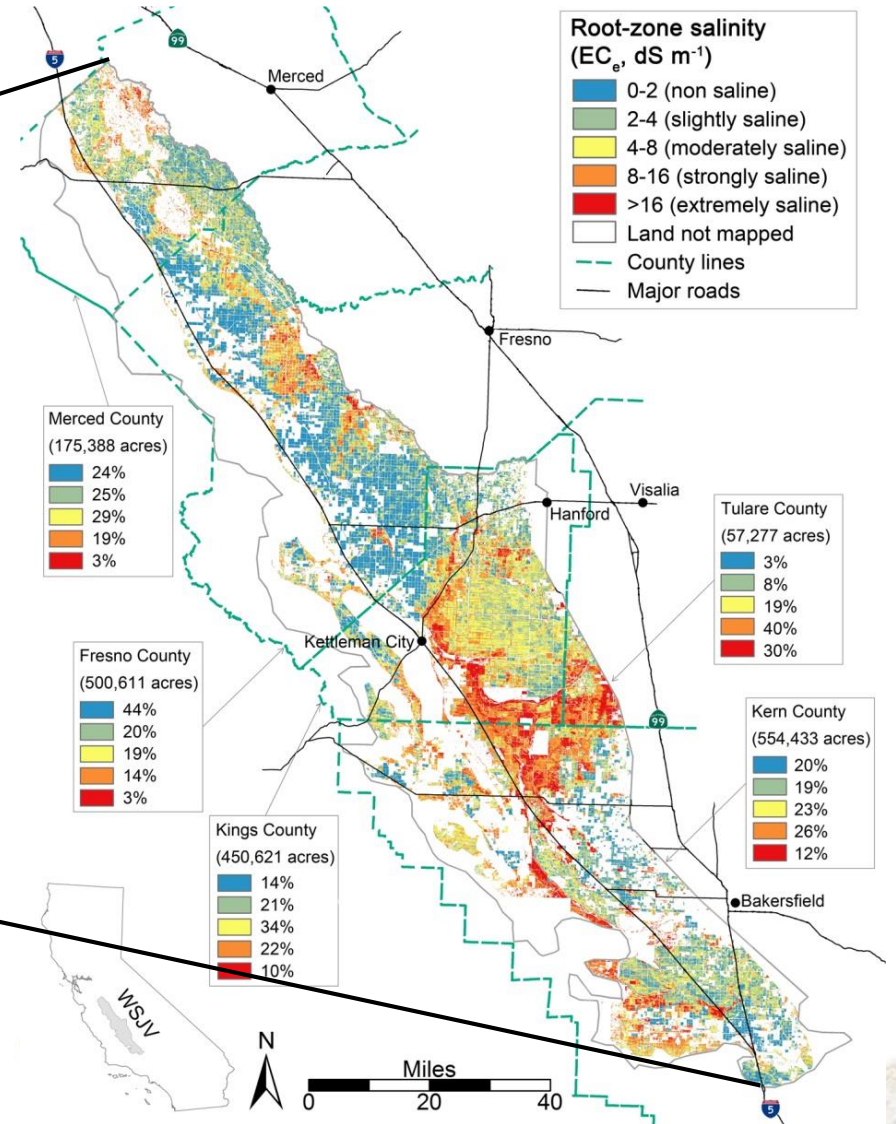


SALT-AFFECTED SOIL AREAS IN THE UNITED STATES HAVING APPRECIABLE AGRICULTURE PRODUCTIVITY

LEGEND

Symbol	Description
1 aa	Saline over < 3% of area (for irrigated land only)
1 a	" " 3-20% " " " "
1 b	" " 20-50% " " " "
1 c	" " > 50% " " " "
2 aa	Sodic without structural B horizon over < 3% of area (for irrigated land only)
2 a	" " 3-20% " " " "
2 b	" " 20-50% " " " "
2 c	" " > 50% " " " "
3 aa	Sodic with structural B horizon over < 3% of area (for irrigated land only)
3 a	" " 3-20% " " " "
3 b	" " 20-50% " " " "
3 c	" " > 50% " " " "
4 aa	Salt-affected (undifferentiated) over < 3% of area (for irrigated land only)
4 a	" " 3-20% " " " "
4 b	" " 20-50% " " " "
4 c	" " > 50% " " " "

USDA-ARS
US Salinity
Laboratory
(ca. 1970)



Root-zone salinity (EC_e, dS m⁻¹)

- 0-2 (non saline)
- 2-4 (slightly saline)
- 4-8 (moderately saline)
- 8-16 (strongly saline)
- >16 (extremely saline)
- Land not mapped
- County lines
- Major roads

Merced County (175,388 acres)

- 24%
- 25%
- 29%
- 19%
- 3%

Fresno County (500,611 acres)

- 44%
- 20%
- 19%
- 14%
- 3%

Kings County (450,621 acres)

- 14%
- 21%
- 34%
- 22%
- 10%

Tulare County (57,277 acres)

- 3%
- 8%
- 19%
- 40%
- 30%

Kern County (554,433 acres)

- 20%
- 19%
- 23%
- 26%
- 12%

Scudiero et al. (2017). *California Agriculture*

Spatial variability across different scales

Spatial variability of salinity influenced by multiple factors which result in high short-range variability at the field scale.

Often, because of different management (irrigation water quality) neighboring fields are characterized by dramatically different salinity levels.



High-resolution remote sensing is an ideal covariate to capture such short-scale changes

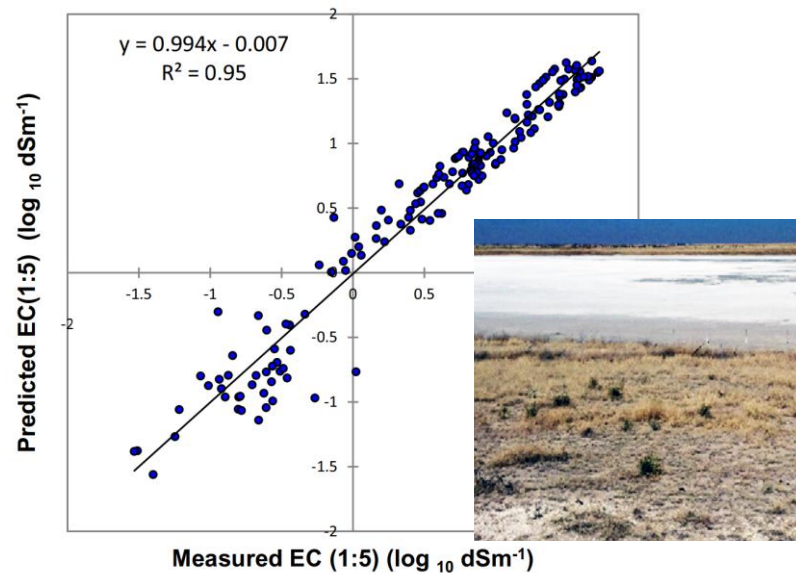
What's needed?

- Select target property (Root-zone soil salinity)
 - Ground truth (Field protocols)
- Ground truth (Regional-scale sampling scheme)
 - Remote sensing (and other covariates)
 - Evaluation strategies

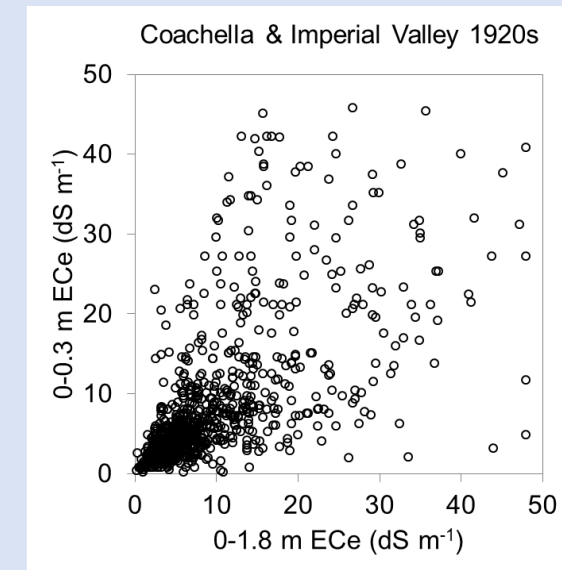
Surface Vs. root zone soil salinity

Surface Soil Salinity

GREAT PAPER → Aldabaa et al. (2015).
Combination of proximal and remote sensing
methods for rapid soil salinity quantification.
Geoderma, 239, 34-46.



Mapping **root zone** soil salinity is more relevant in agricultural soils
>> surface salinity levels are not a reliable direct indicator of subsurface salinity levels

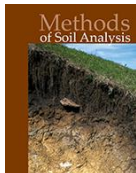
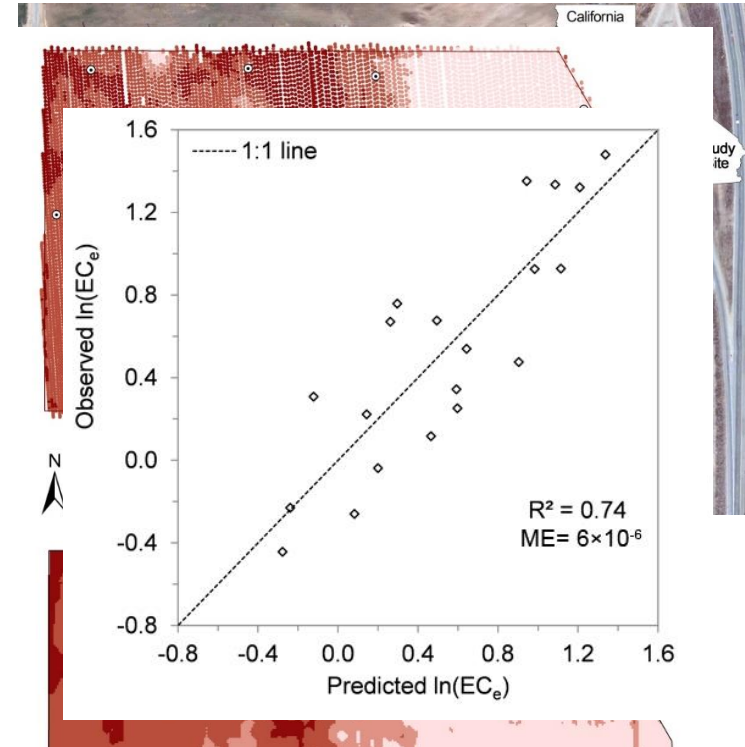


Scudiero et al. (In preparation)

Apparent Electrical Conductivity (ECa) – Directed soil sampling

Developed by Corwin and colleagues in the past 40 years

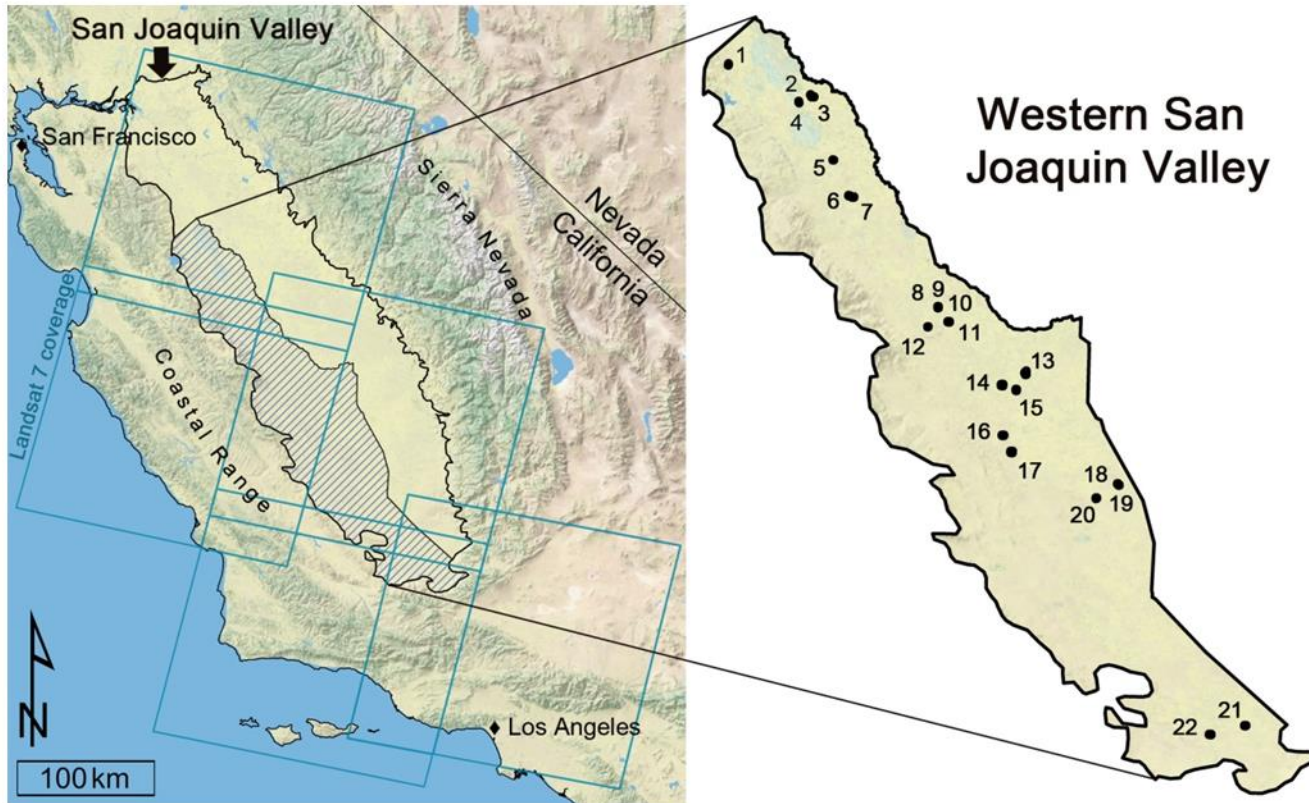
- Mapping soil salinity at a 32.4-ha field near San Jacinto, CA
- >16,000 Apparent electrical conductivity measurements (EC_a) [sensor measurements for the 0–1.5 m soil profile]
- “*ECa-directed soil sampling*”
Select 20 soil sampling locations
- Salinity (EC_e) measured for the 0–1.2 m soil profile
- EC_a –salinity linear modeling
- Spatial interpolation of regression estimations
- Map salinity at the same resolution of the selected satellite product (e.g., 30x30 m pixels)



Corwin, D.L., Scudiero, E., 2016. Field-Scale Apparent Soil Electrical Conductivity, In: Logsdon, S. (Ed.), Methods of Soil Analysis. Soil Science Society of America, Madison, WI, USA. doi: 10.2136/methods-soil.2015.0038

Ground-truth measurements

- 22 fields sampled in 2013 (ca. 550 ha) in western San Joaquin Valley, CA
- **~6000 ground truth cells (30x30 m resolution).** Overall accuracy $R^2 = 0.93$



Try to get a representative sampling scheme:

- Soil type
- Irrigation management
- Crop type
- Climatic regions
- Other factors known to influence spatial variability of soil salinity

Root-zone salinity via crop canopy measurements

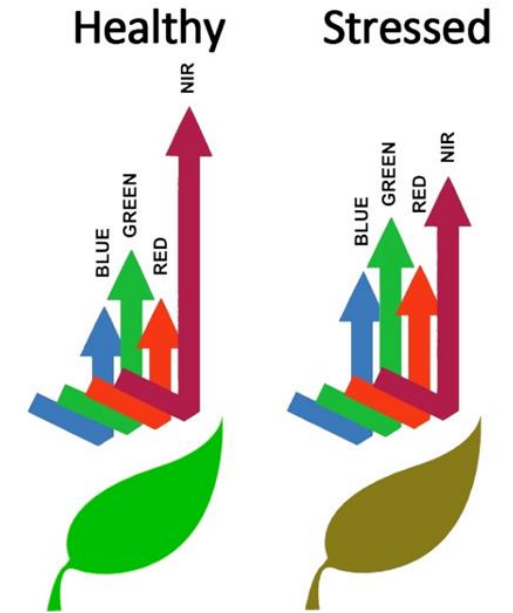
Surface reflectance is influenced by:

- Relative crop status
→ **stressed vs. non-stressed**
(e.g., B,G,R → photosynthesis activity; NIR → turgor; thermal imagery can also be used)
- Crop type
- Growth stage
- Soil type (texture, SOC, iron, salt crust, ...)
- A variety of vegetation indices can be used

Canopy Response Salinity Index

$$CRSI = \sqrt{\frac{(NIR \times R) - (G \times B)}{(NIR \times R) + (G \times B)}}$$

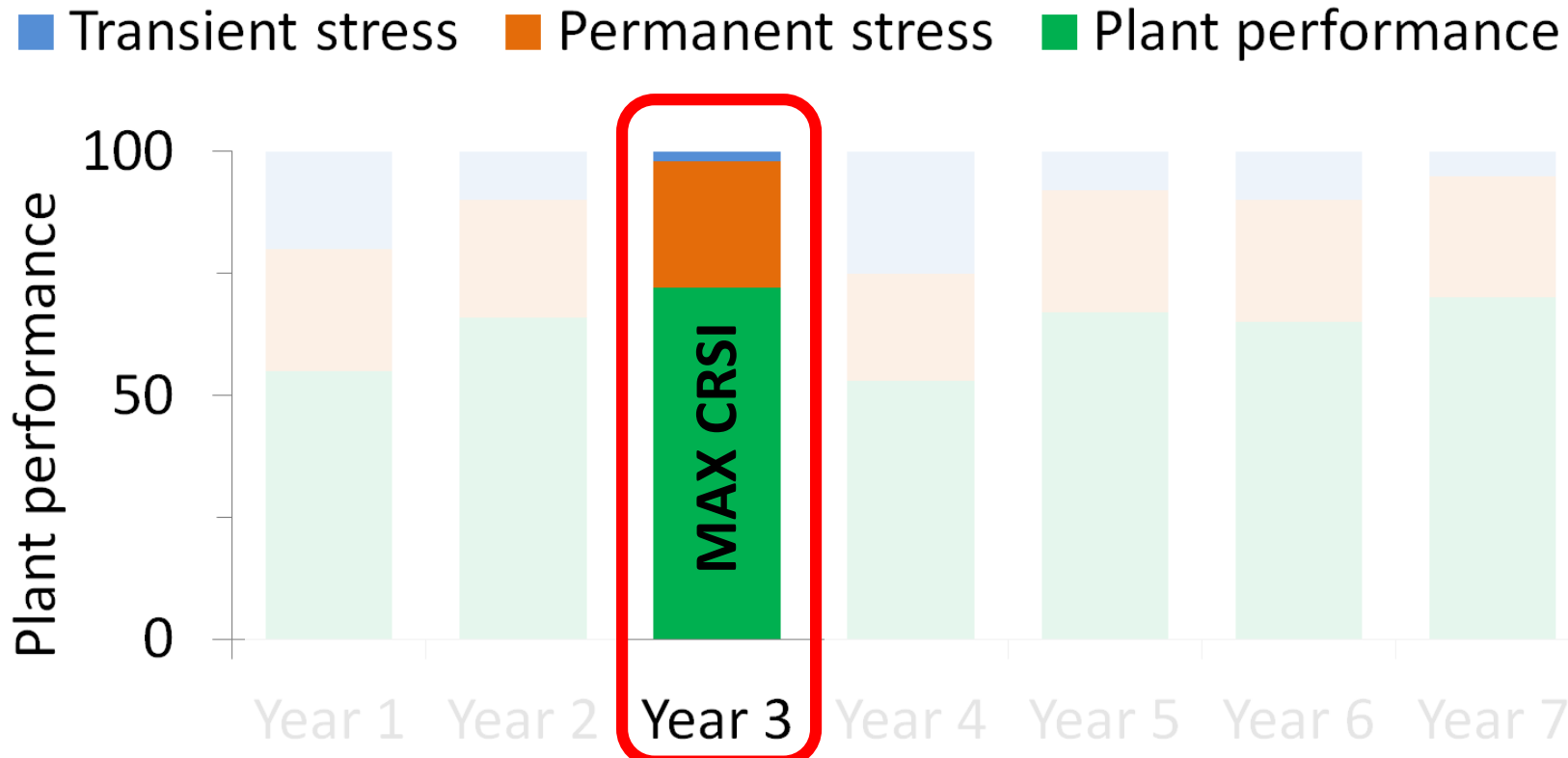
^a Landsat 7 spectral bands: blue (B), green (G), red (R), near-infrared (NIR)



GROUND-TRUTH SAMPLING IS NEEDED!!

Multiyear max CRSI and soil salinity

- Under similar management, **salinity stress (permanent stress)** is fairly constant in the root-zone through a limited amount of time
- Plant performance (measured with CRSI) is maximum when transient stress sources are at minimum → **salinity effect on plant growth is highlighted**



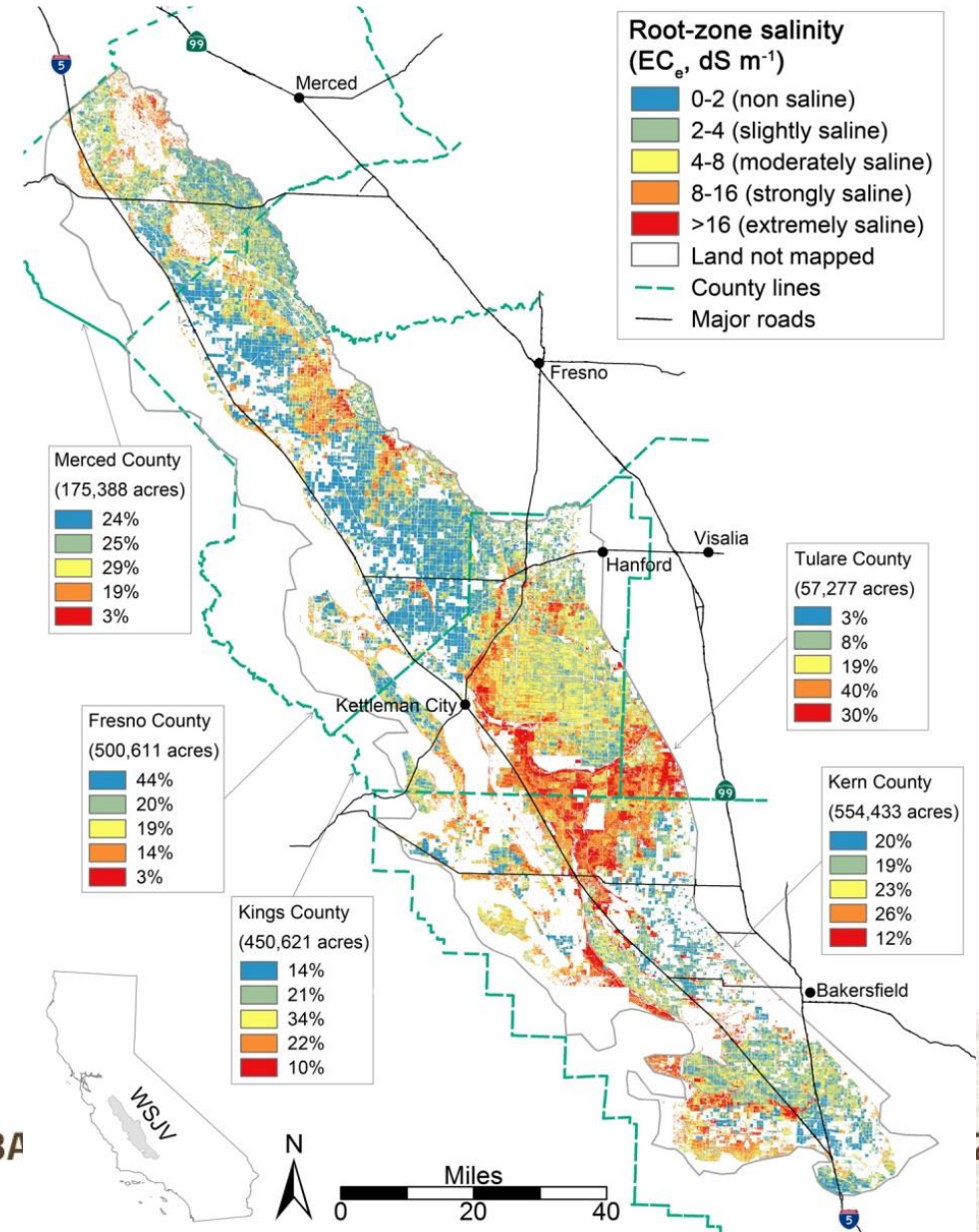
Soil salinity Vs. multiyear max CRSI (and additional covariates)

$E_{ce} \sim$ Multi-year Max CRSI

- + weather info for the selected year
- + crop type/ irrigation management
- + soil type / particle size information

Before publishing your map:

- Spatially-independent cross-validation (e.g., leave-one-field-out)
- Independent data
- Ask a farmer!



Limitations and research gaps

- Uncertainty of predictions at low salinity values
- Halophyte reflectance properties are problematic
- Published work does not focus on tree crops
(complex spatiotemporal dynamics of salinity in the root zone especially with micro-irrigation)
- Selection of satellite products
(need for high spatial and temporal resolution for VIS+NIR+Thermal)
- Improve root-zone depth for different crops
(x soil x management)
- Current work: spatiotemporal prediction model
(with ground-truth data spanning over 30 years)



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