



California State University
MONTEREY BAY
Extraordinary Opportunity

Satellite Mapping of Crop Water Requirements for Irrigation Management Support

June 11, 2014

Forrest Melton

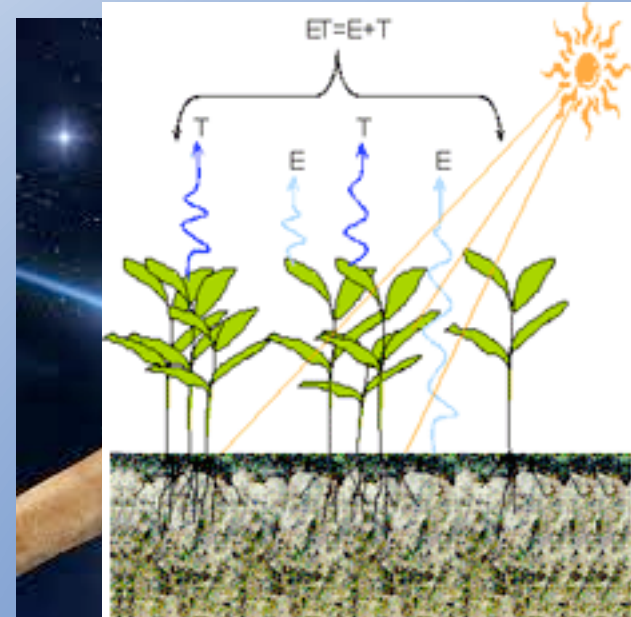
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CSU Monterey Bay / NASA ARC-CREST

Partners:

CA Dept. of Water Resources, Western Growers Association, Center for Irrigation Technology / CSU Fresno, USDA ARS / NRCS, Univ. of California Cooperative Extension, USGS, Booth Ranches, Chiquita, Constellation Wines, Del Monte Produce, E & J. Gallo, Farming D, Fresh Express, Pereira Farms, Ryan Palm Farms, Tanimura & Antle

NASA + ET?



Evapotranspiration (ET): water consumed (lost to atmosphere) by combined processes of soil evaporation & plant transpiration

Basal ET (ET_{cb}): ET for well-watered crop on a dry soil surface

Earth Science Missions in Operation



Benefits of Using Ag Weather Information in Irrigation Management

- California Department of Water Resources and UC Berkeley surveyed growers in 1990s
- Growers who utilized weather and ET_o data reported an increase in yields of 8% and a decrease in applied irrigation of 13% (DWR, 1997)

Method Used by Farmers to Decide When to Irrigate, USDA Farm & Ranch Irrig. Survey, 2008

<u>Method</u>	<u>Percent of Farmers</u>	
	<u>CA</u>	<u>US</u>
Condition of Crop	66%	78%
Feel of soil	45%	43%
Personal calendar schedule	32%	25%
Soil moisture sensing device	14%	9%
Daily ET reports	12%	9%
Scheduled by water delivery org.	11%	12%
Commercial or government scheduling service	10%	8%
When neighbors irrigate	6%	7%
Other	6%	9%
Plant moisture sensing device	3%	5%

Growers may report more than one method, so total of all methods may exceed 100%.



Opportunity

Standard approach for incorporating information on weather / crop stage into irrigation management practices:

$$ET_c = ET_o * (K_{cb} + K_e)$$

\nearrow
CIMIS

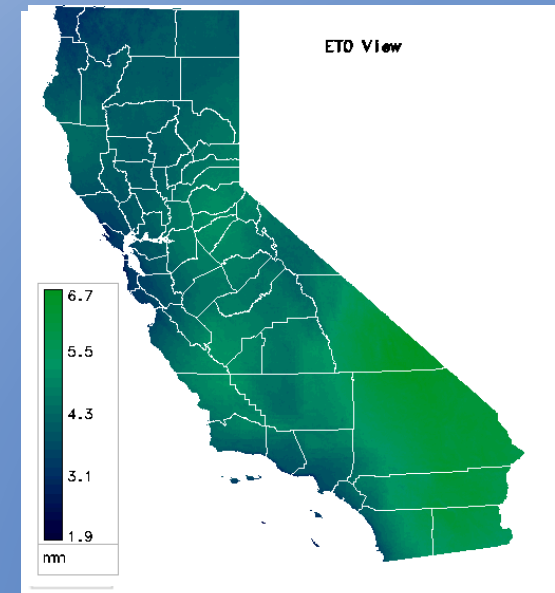
\nwarrow
Satellite



Photo credit: DWR CIMIS

California Irrigation Management Information System (CIMIS)

- Operated by CA DWR since 1982
- >140 stations currently providing daily measurements of ET_o
- **Spatial CIMIS** data now available for CA; 2km statewide grid, daily
- Crop coefficient mapping identified by CA DWR as high priority need for CIMIS



Spatial CIMIS ET_o

Combining Surface and Satellite Data: Mapping of Crop Water Requirements at Field Scales



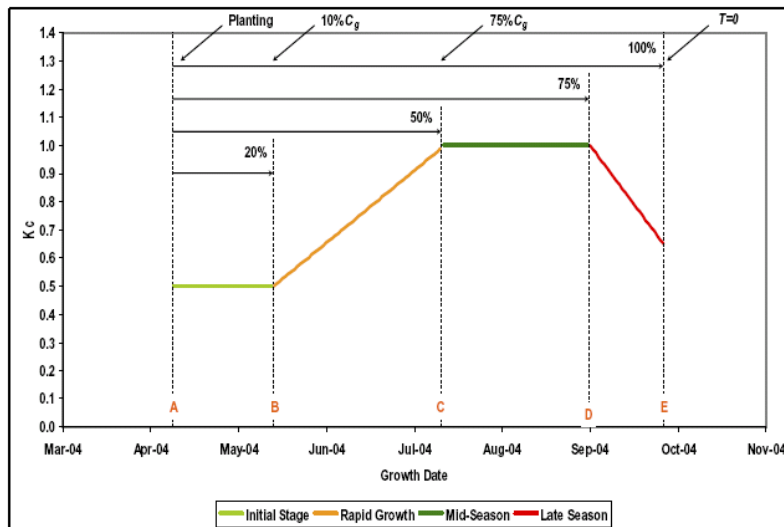
$$ET_{cb} = ET_o * K_{cb}$$

CIMIS
(AgriMet, AZMET, CoAgMet)

satellite

Standard K_c Profile (manual)

Hypothetical Crop Coefficient (K_c) Curve for Typical Field and Row Crops Showing Growth Stages and Percentages of the Season from Planting to Critical Growth Dates



TOPS-SIMS K_{cb} Profile (Automated, Satellite-derived)

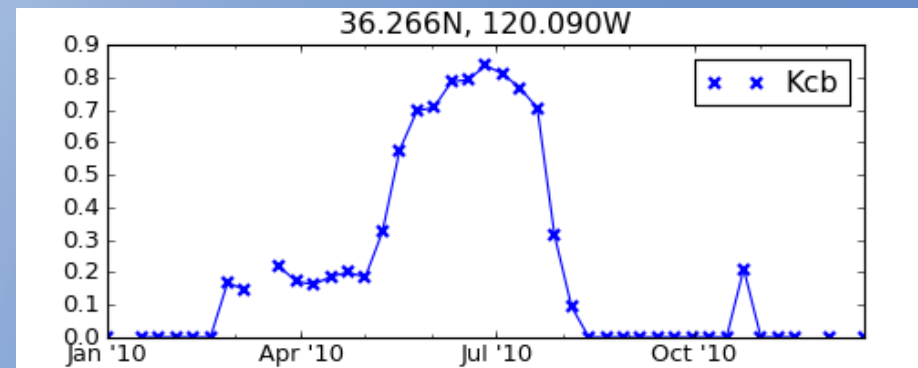


Figure credit: 2005 California Water Plan Update



Problem Statement

- Increased access to information on crop evapotranspiration can support California growers in improving on-farm water use efficiency
- Information must be:
 1. Timely and reliable
 2. Specific to individual fields
 3. Easy to access
 4. Easy to use
 5. Accuracy of data must be clearly defined
- Project philosophy:
 - Irrigation management is complex → growers are in the best position to determine their crop water needs, and,
 - Better information leads to better decisions



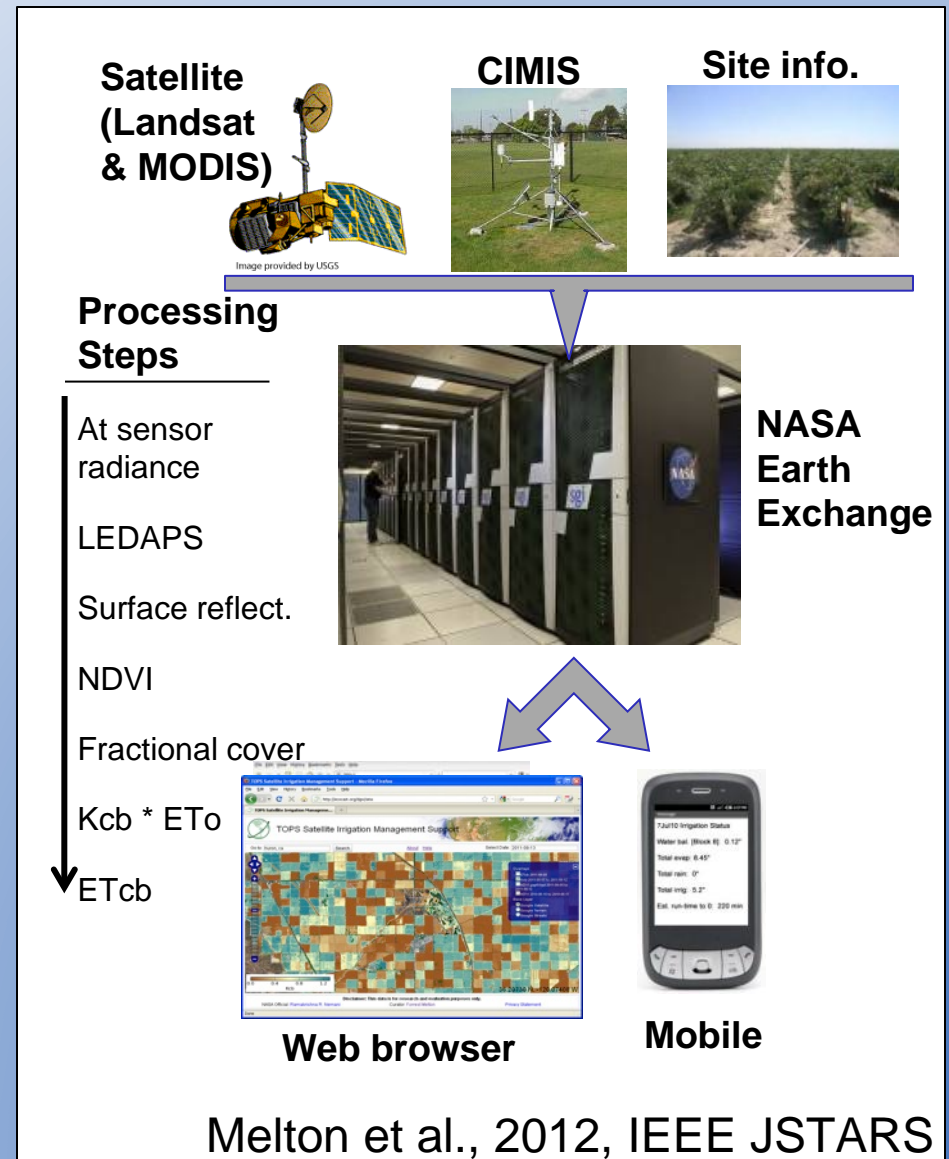
Satellite Irrigation Management Support (SIMS): Objectives



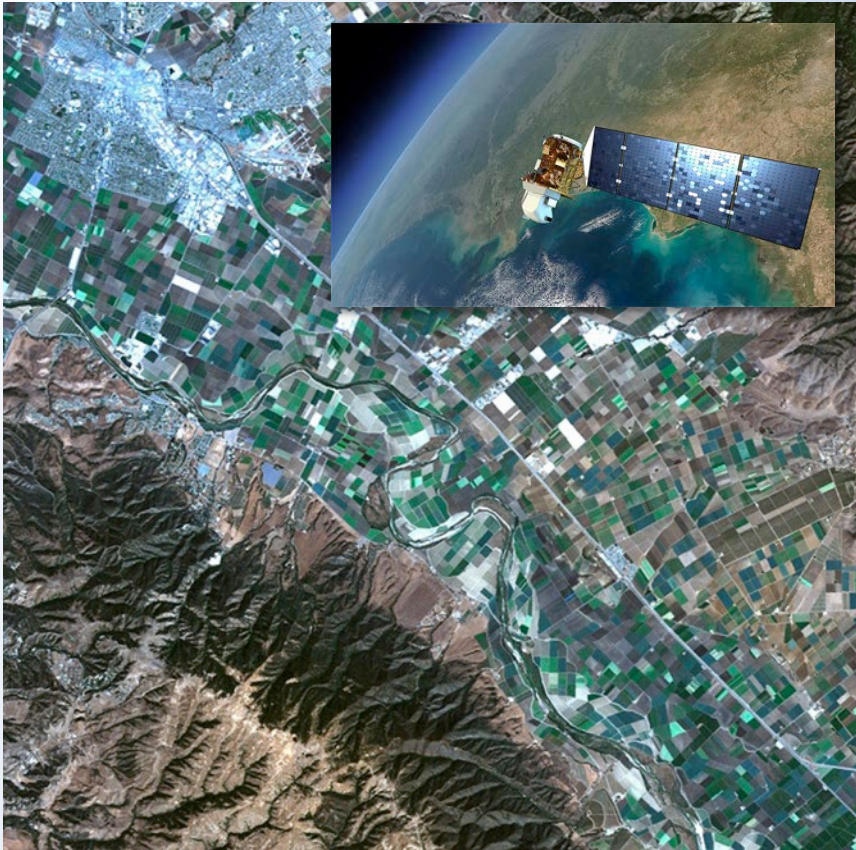
- 1) Develop near real-time estimates of crop water requirements from satellite data to assist growers in managing irrigation, and water managers in improving estimates of agricultural water requirements
- 2) Provide web and mobile data interfaces to increase the ability of the agricultural community to access and use satellite data in irrigation management and crop monitoring

Satellite Irrigation Management Support (SIMS) Framework

1. Integration of satellite and surface measurements
2. Prototyping accelerated by NASA high end computing resources
3. Integration with irrigation management tools (CropManage, VSIM)
4. Freely available data
5. Outreach and education through partnerships with Western Growers and agricultural extension services



Satellite Data

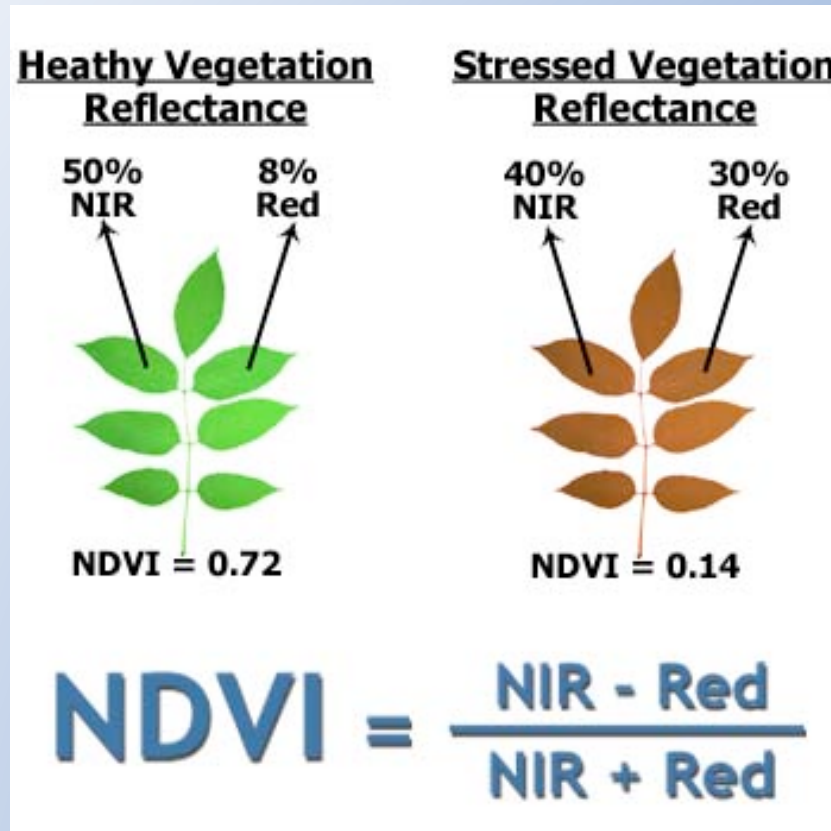


Landsat (TM / ETM+ / OLI)
30m / 0.25 acres
Overpass every 8-16 days



Terra / Aqua (MODIS)
250m / 15.5 acre
Daily overpass

Normalized Difference Vegetation Index



Credit: ODIS

Commonly used remote sensing index of vegetation condition



TOPS Satellite Irrigation Management Support

Username:

Password:

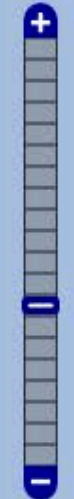
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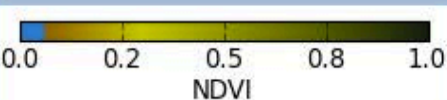
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Select Date: 2011-07-07



Normalized Difference
Vegetation Index
(NDVI); 8-day
composite from Landsat
and MODIS



SIMS Data Layers

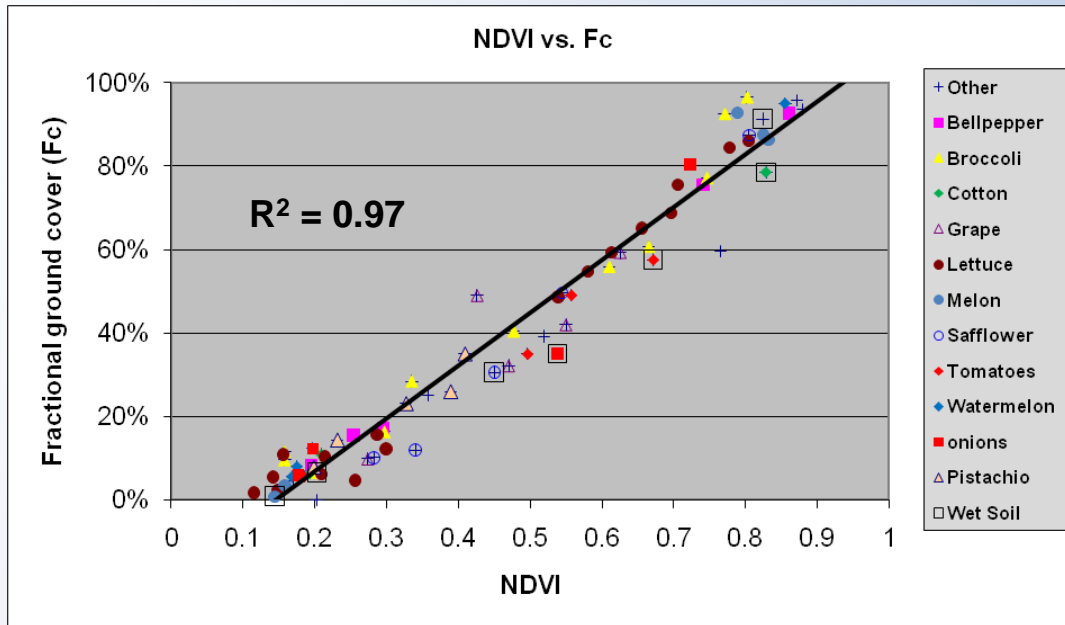
- ☐ ETcb
2011-07-07
- ☐ Crop coefficient (Kcb)
2011-07-04 to 2011-07-11
- ☒ Veg. Index (NDVI) gapfilled
2011-07-04 to 2011-07-11
- ☐ Veg. Index (NDVI)
2011-07-04 to 2011-07-11

Base Layer

- ☒ Google Satellite

35.39402 N, -119.85320 W

Approach: Mapping Crop Coefficients and Indicators of Crop Water Requirements from Satellite Data

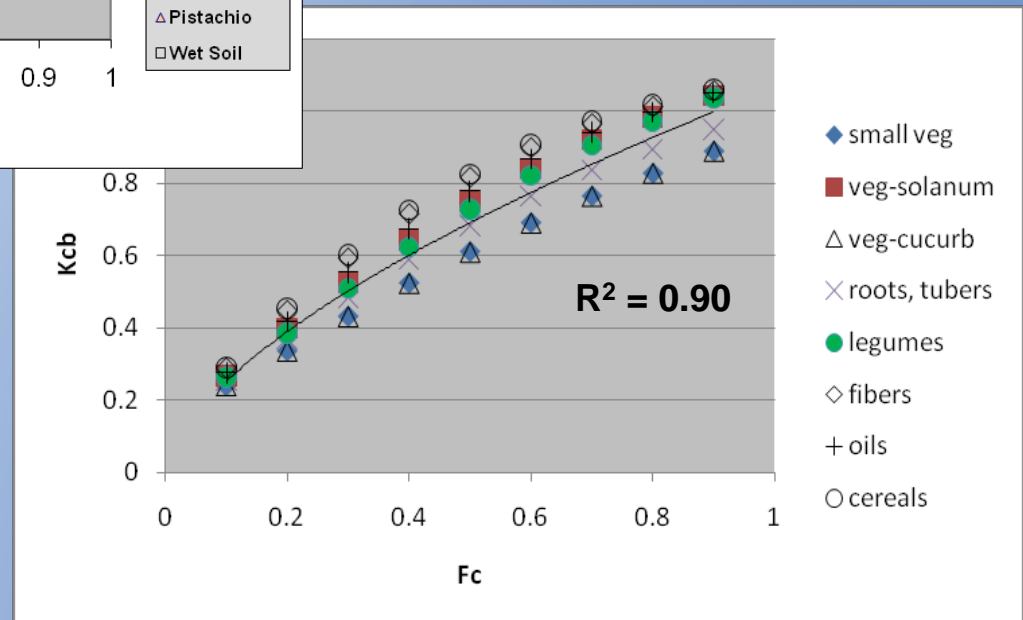


USDA studies provide basis for linking satellite vegetation indices (NDVI) to fractional cover.

Annuals

Trout et al., 2008; Johnson & Trout, 2011

Recent studies by Allen & Pereira (2009) and others provide basis for linking fractional cover to K_{cb} for a range of crops.



Also see Bryla et al., 2010; Grattan et al., 1998; Hanson & May, 2006; Lopez-Urrea et al., 2009



TOPS Satellite Irrigation Management Support

Username:

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Select Date: 2013-07-17



2013-07-17: 37.0124023763, -120.277437053

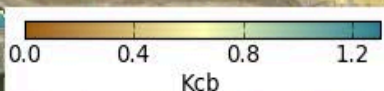
	current value	2010 history	2011 history	2012 history	2013 history	2014 history
ndvi	0.500859	graph csv	graph csv	graph csv	graph csv	graph csv
ndvi_GF	0.500859	graph csv	graph csv	graph csv	graph csv	graph csv
Fc	0.500859	graph csv	graph csv	graph csv	graph csv	graph csv
Kcb	0.767559	graph csv	graph csv	graph csv	graph csv	graph csv
ETcb	0.208233	graph csv	graph csv	graph csv	graph csv	graph csv
cropType	almond					

SIMS Data Layers

- ☐ ETcb
2013-07-17
- ☒ Crop coefficient (Kcb)
2013-07-12 to 2013-07-19
- ☐ Fractional Cover (FC)
2013-07-12 to 2013-07-19
- ☐ Veg. Index (NDVI) gapfilled
2013-07-12 to 2013-07-19
- ☐ Veg. Index (NDVI)
2013-07-12 to 2013-07-19

Base Layer

- ☒ Google Satellite
- ☐ Google Physical
- ☐ Google Streets



AmBAG, DigitalGlobe, Landsat

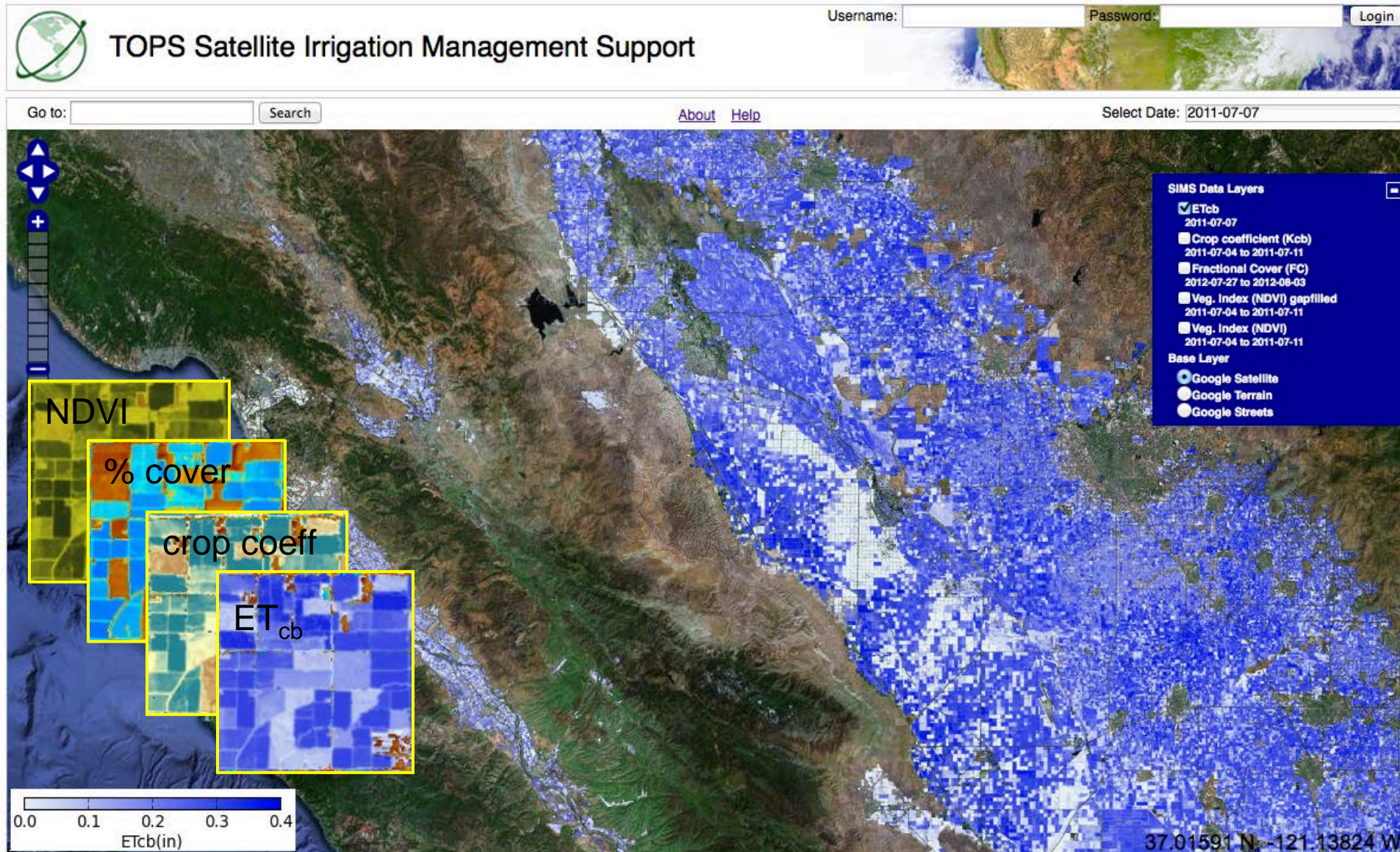
37.02652 N, -120.21358 W

Disclaimer: This data is for research and evaluation purposes only.

NASA Official: [Ramakrishna R.Nemani](#)Curator: [Forrest Melton](#)[Privacy Statement](#)

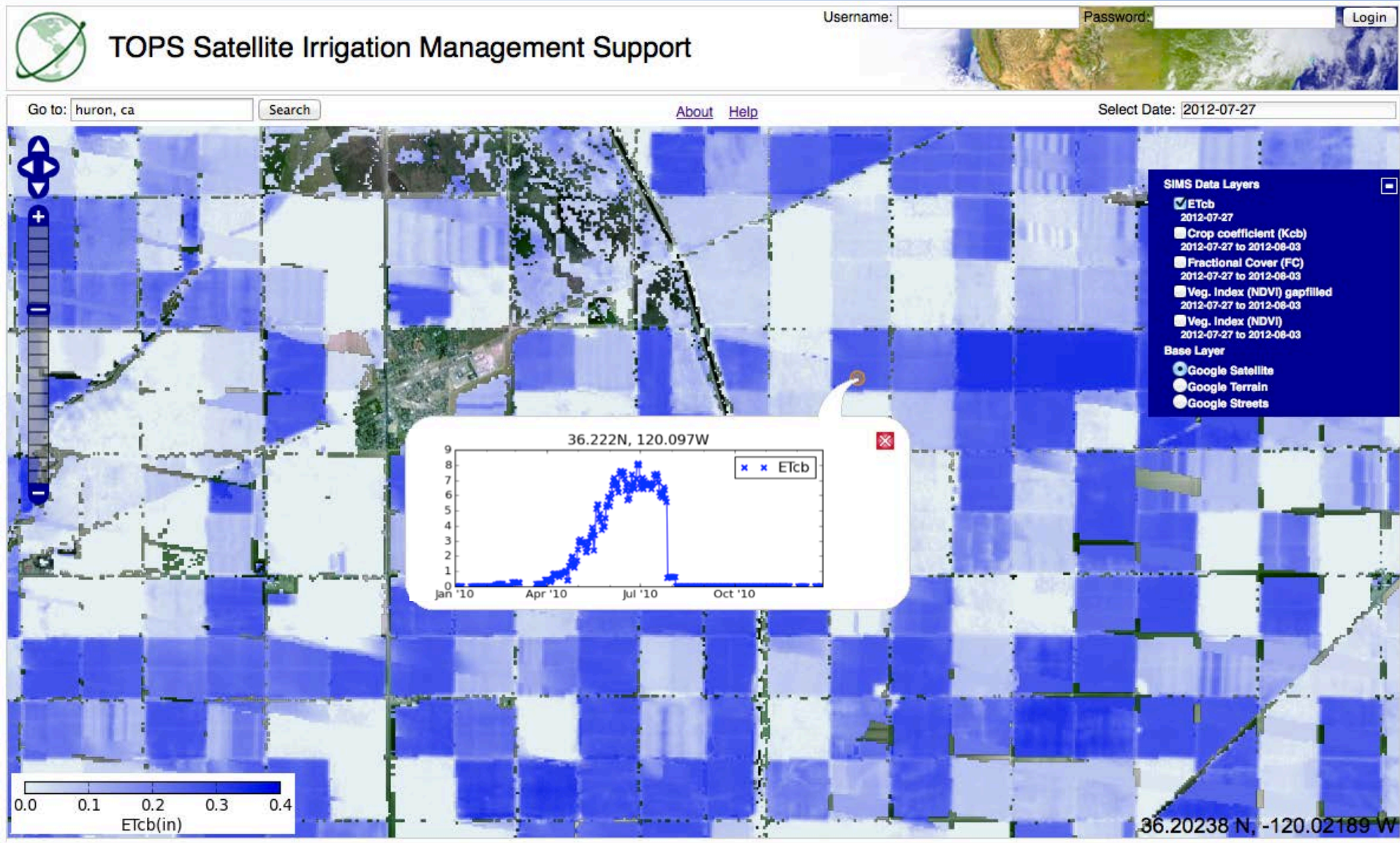


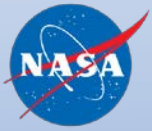
Satellite Irrigation Management Support (SIMS) Framework



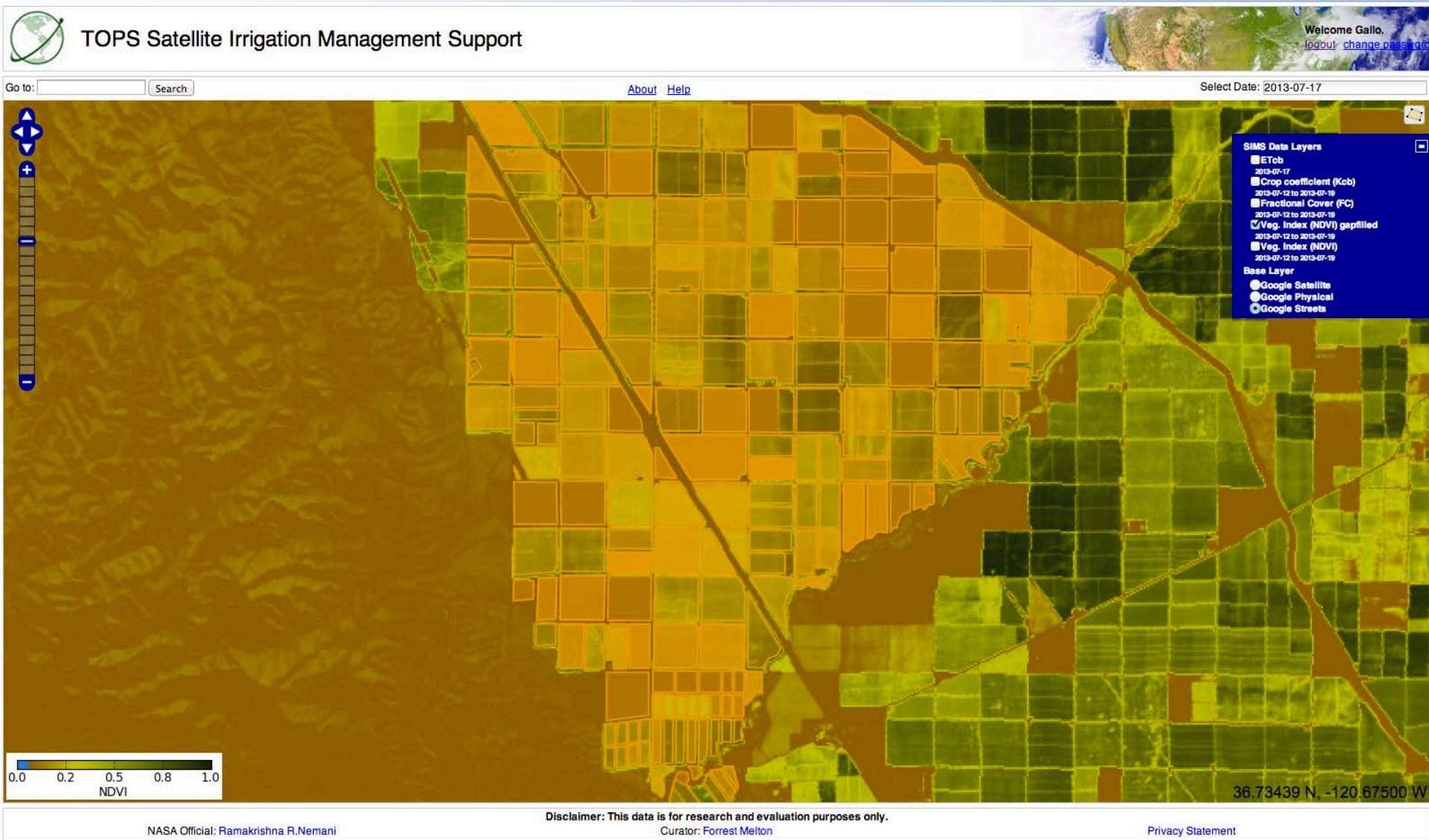


Satellite Irrigation Management Support (SIMS) Framework



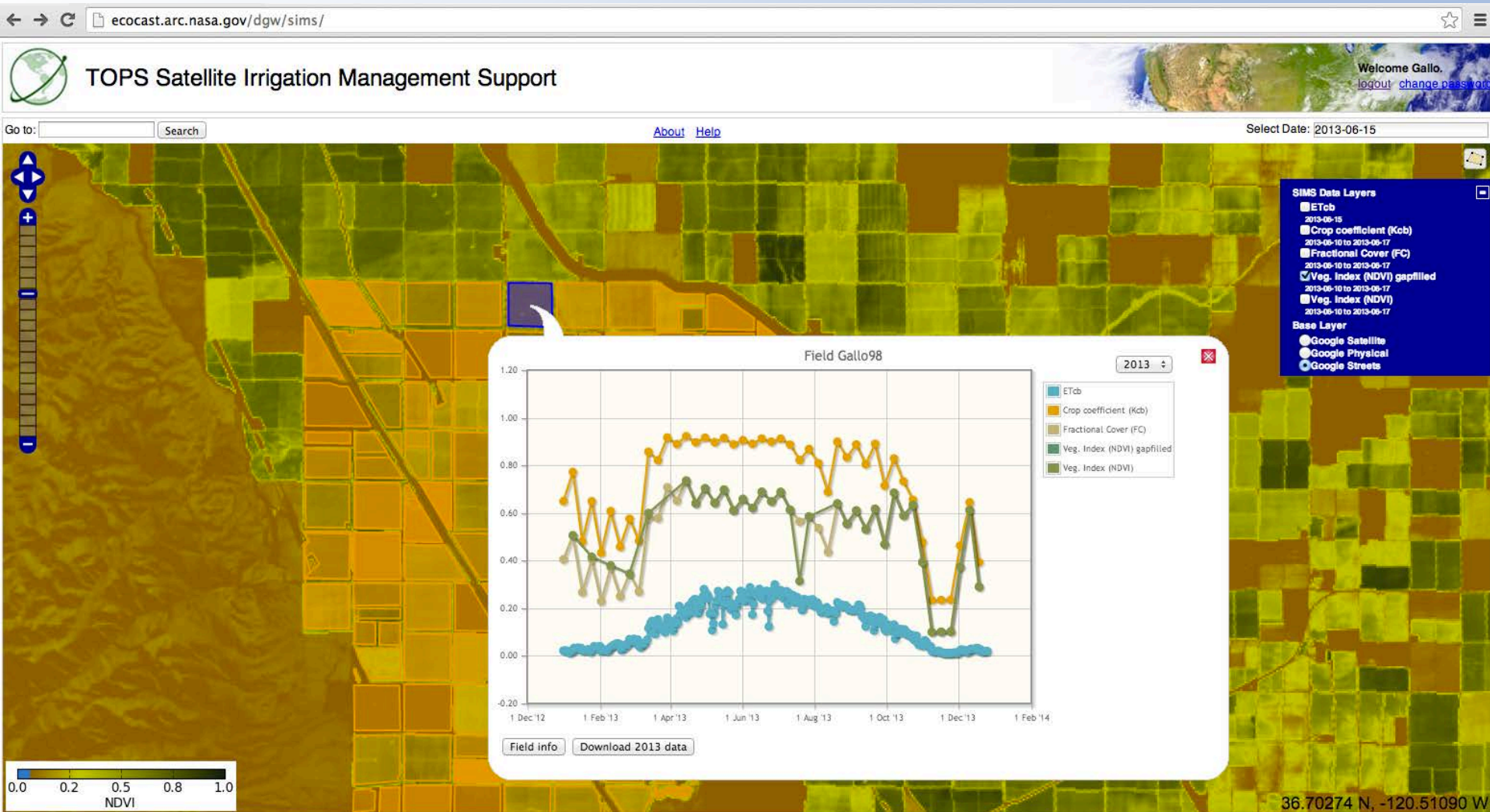


Tracking Conditions Across Fields

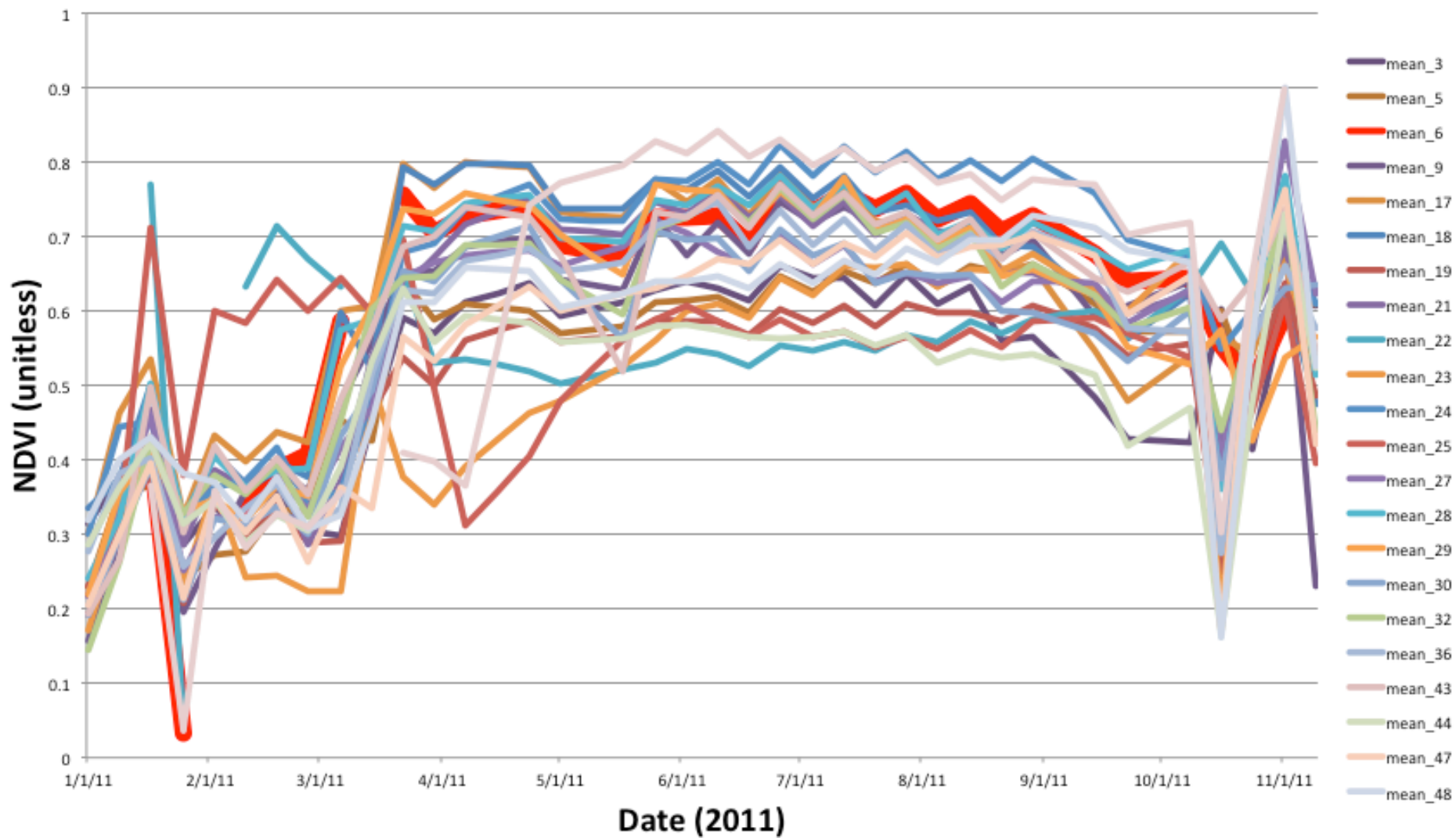




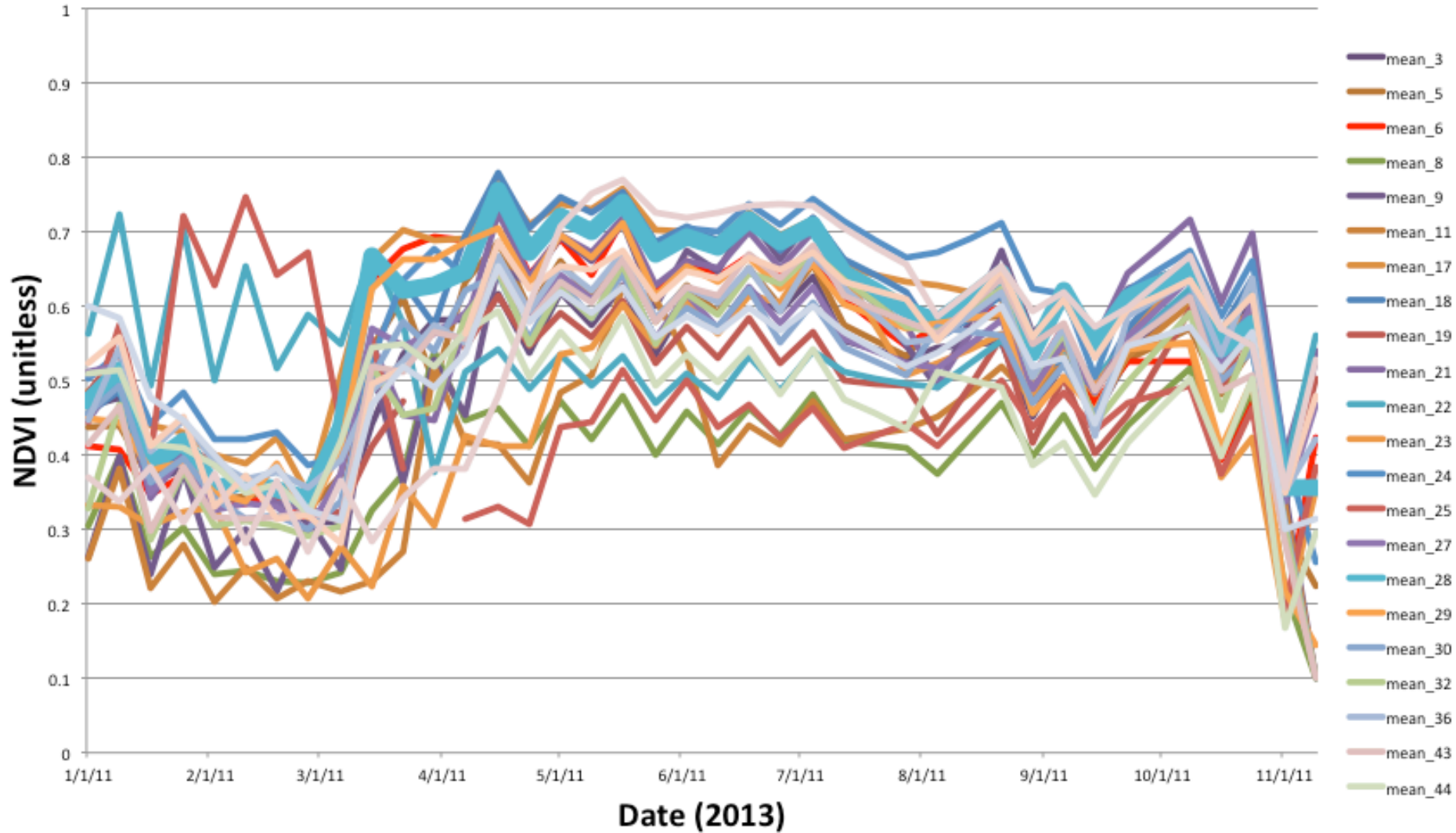
Tracking Conditions Across Fields



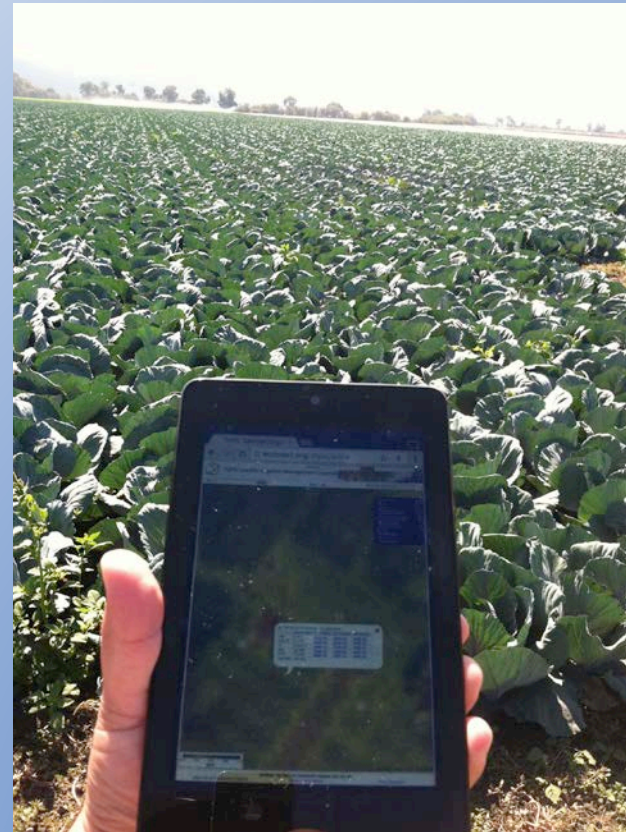
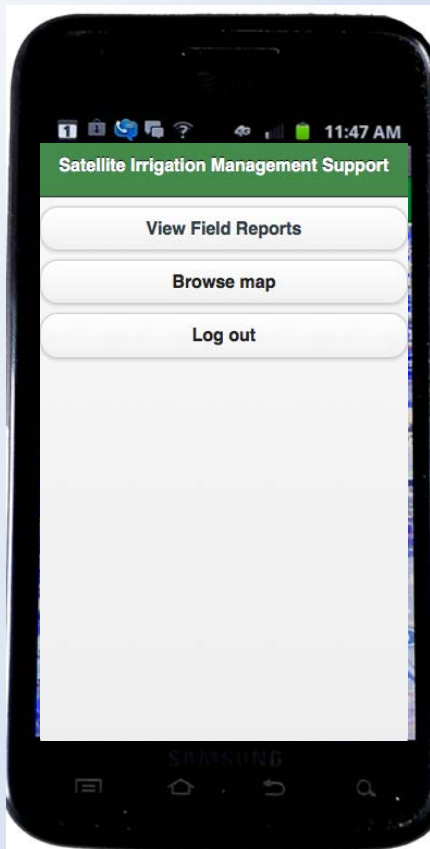
Tracking Conditions Across Years



Tracking Conditions Across Years



Delivering Data to the Field: Mobile Interfaces



Mobile-based interfaces important for enhancing access to data



Field Validation Strategy

Goal: Calculate daily ET for a wide range of crops and growth forms (graminoids, short forbs, tall forbs, vines, and trees) using two cost-effective and independent approaches at each site.

Approach 1) Water Balance: $ET = P + I - D - \Delta S$

Where ET is evapotranspiration, P is precipitation, I is irrigation, D is drainage below the root zone, and ΔS is change in volumetric water content

Approach 2) Surface Renewal Energy Balance:

$$ET = R_n - H - G$$

Where ET is evapotranspiration, R_n is net radiation, H is sensible heat flux, and G is ground heat flux

Verification and Validation: Sensor Networks





Instrumentation Layout



Point configuration (10):

- P1 10HS 0-4"
- P2 10HS 12-16"
- P3 10HS 24-28"
- P4 MPS-1 14"
- P5 10HS 36-40" / G3 Passive Capillary Lysimeter 44"

Other Instruments:

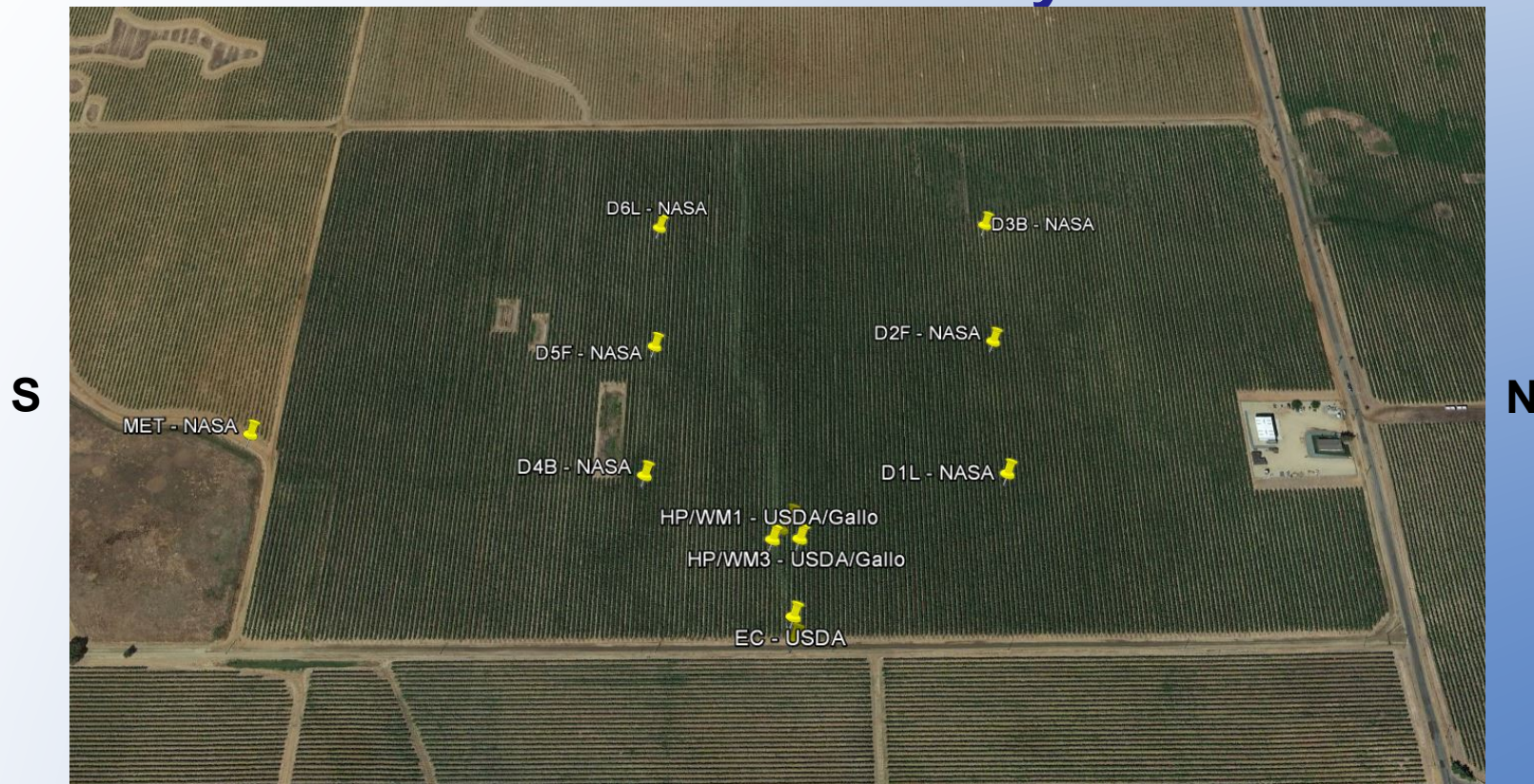
- SR station
- MET station
- In-line flow meter

Site Info:

- Block #4
- Bed Width: 60"
- Furrow: 20"
- Between plants 20"
- Transplant-Double row
- 12" emitter spacing
- South to North flow



Instrumentation Layout



Point configuration (8):

- P1 10HS 0-4"
- P2 10HS 16-22"
- P3 10HS 32-36"
- P4 MPS-1 18"
- P5 10HS 48-52" / G3 Passive Capillary Lysimeter

Other Instruments:

- USDA Eddy Covariance
- MET station
- In-line flow meter

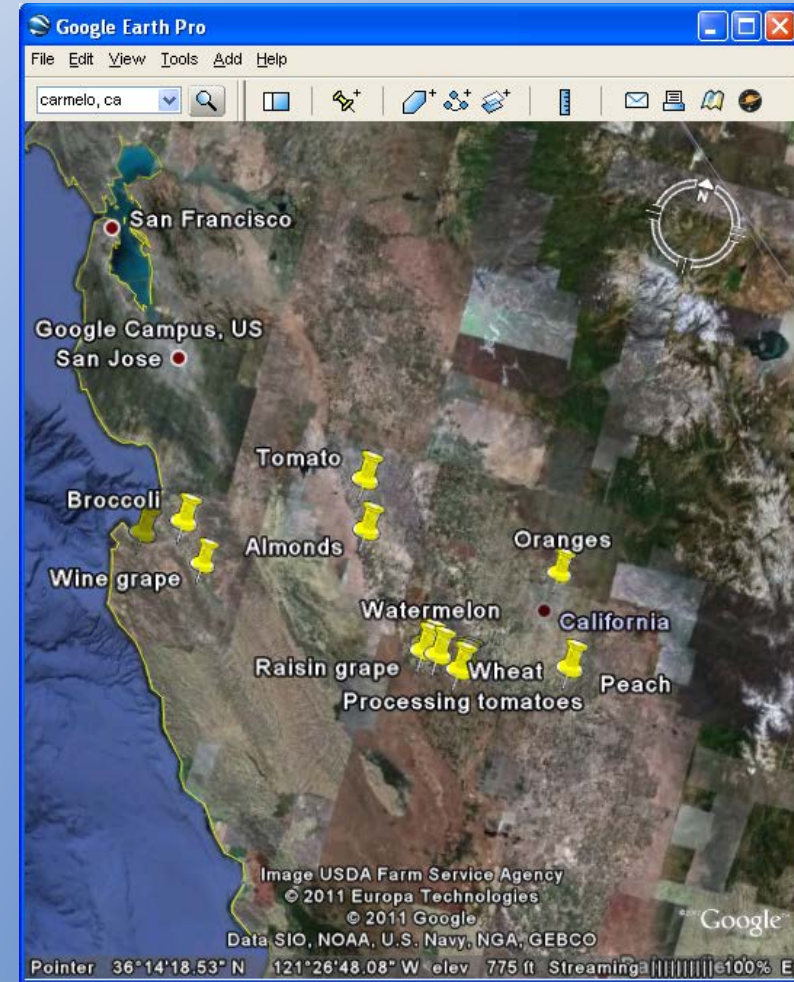
Site Info:

- Row Width: 130"
- Vine spacing: 60"
- Dimensions: Aisle CC12"
- Cover crop: grass

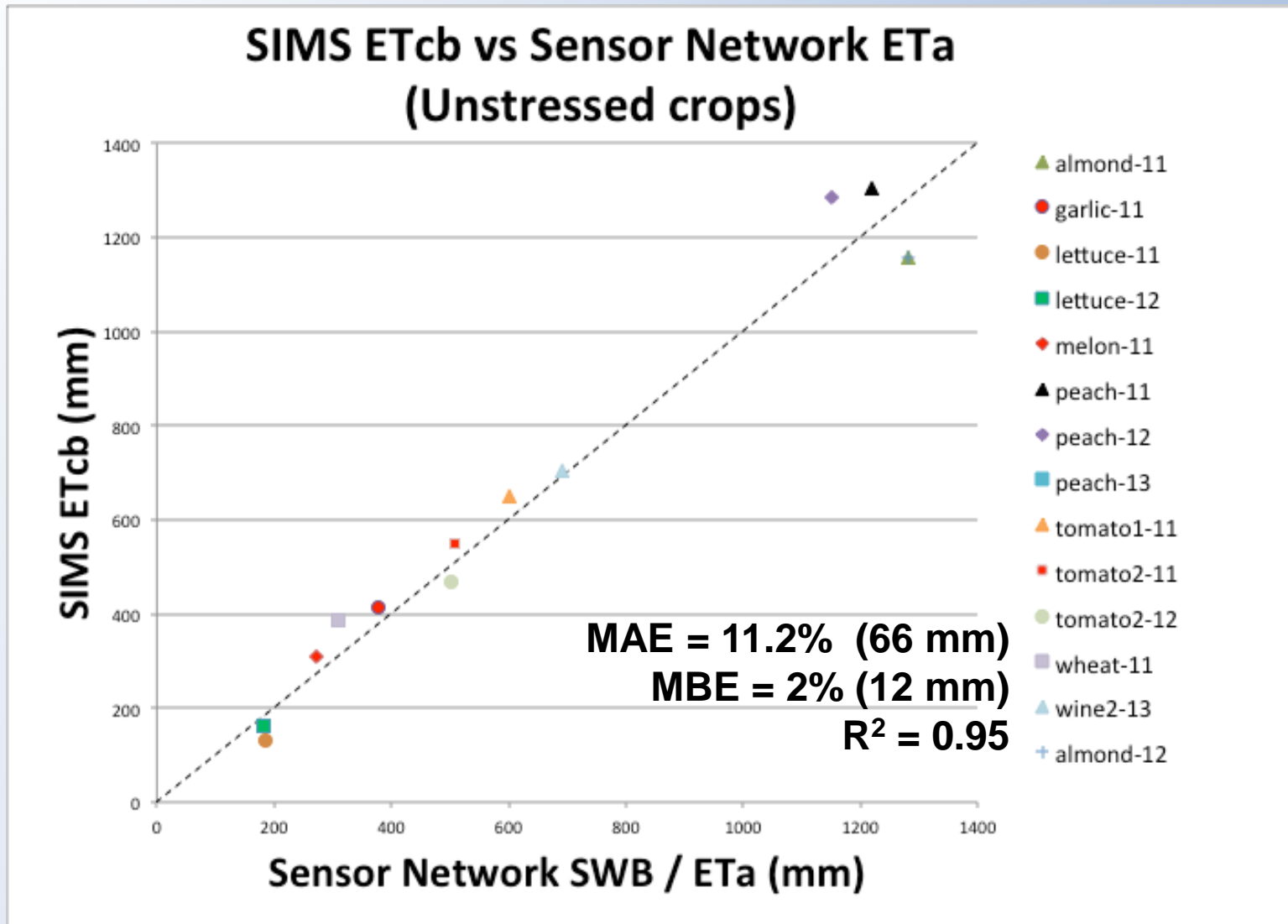
Sensor Network Installations

Crop Type	Crop	Location
Grain	Corn*	CSU Fresno
Grain	Wheat	San Joaquin Valley
Row	Garlic	San Joaquin Valley
Row	Lettuce*	SJ & Salinas Valley
Row	Broccoli*	Salinas Valley
Row	Cauliflower	San Joaquin Valley
Row	Tomato(2)*	San Joaquin Valley
Row	Cotton (drip)*	San Joaquin Valley
Vine	Melon	San Joaquin Valley
Vine	Wine grapes*	Salinas Valley
Vine	Raisins*	San Joaquin Valley
Tree	Peach*	San Joaquin Valley
Tree	Almond*	San Joaquin Valley
Tree	Orange*	San Joaquin Valley

*Surface renewal instrumentation.

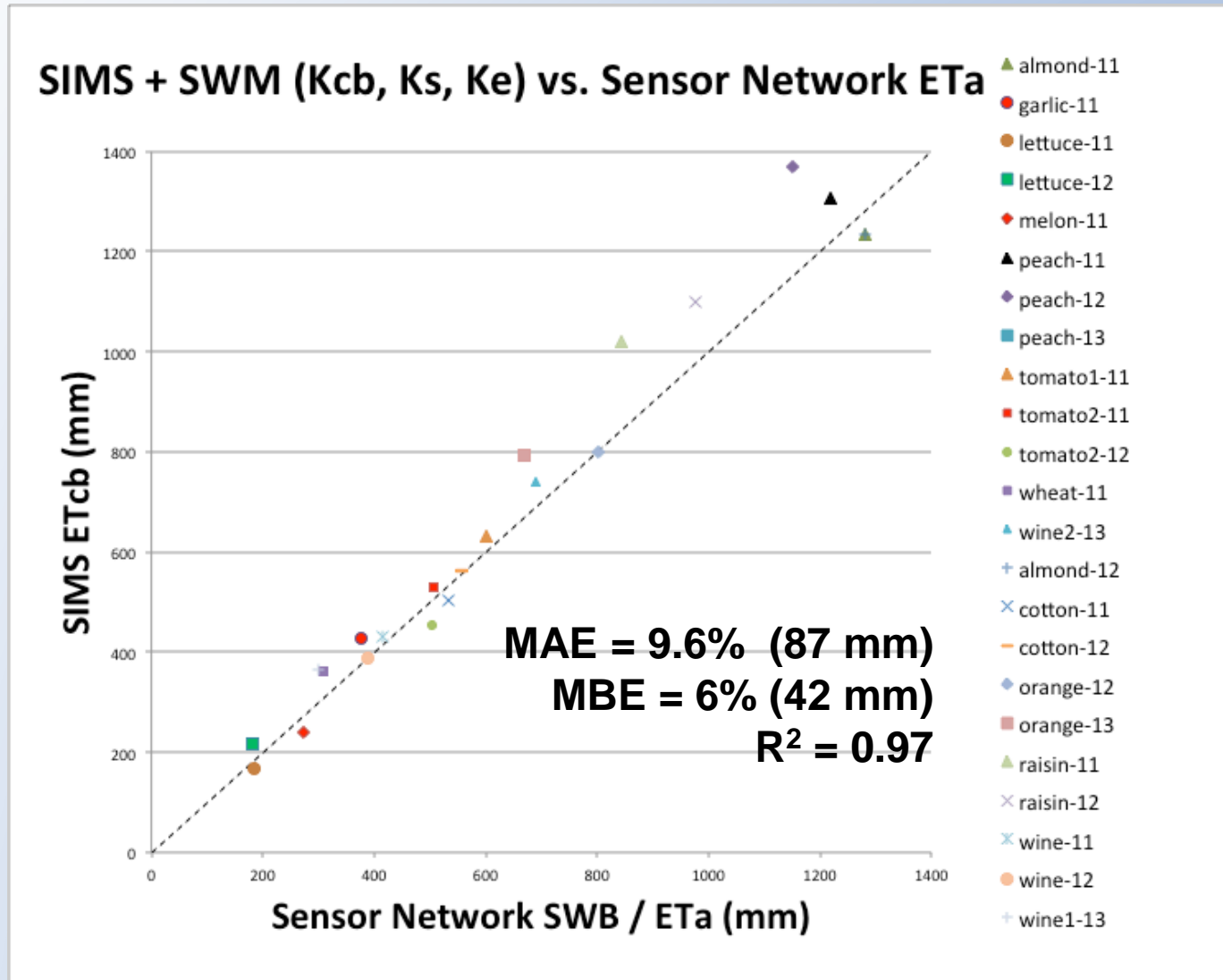


Verification and Validation: Results to date



Comparison of seasonal ET totals from SIMS and the sensor network for sites instrumented in 2011-2013, excluding intentionally stressed crops (wine grapes, raisins, cotton, oranges).

Verification and Validation: Results to date

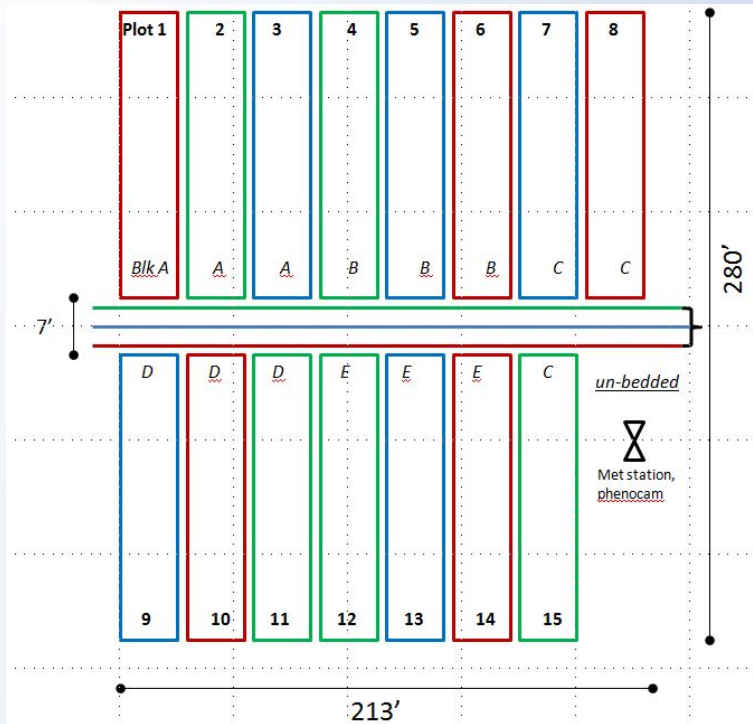


Comparison of seasonal ET totals from SIMS and the sensor network for sites instrumented in 2011-2013. Ke and Ks coefficient via a soil water balance model based on FAO-56 (Allen et al., 1998).

Yield Trials

Lettuce & Broccoli

USDA ARS, Spence Road, Salinas



Treatments:

- Standard practice
- SIMS
- CropManage



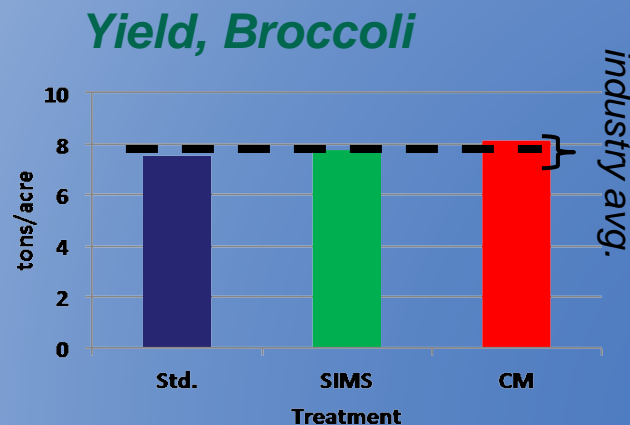
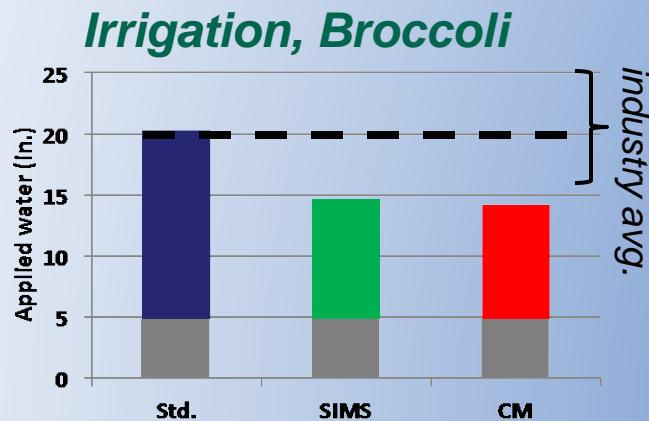
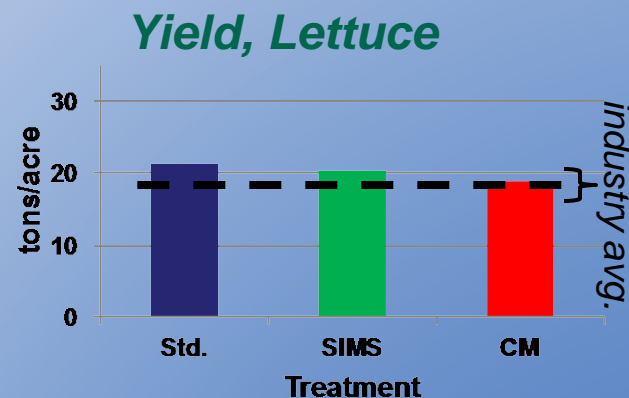
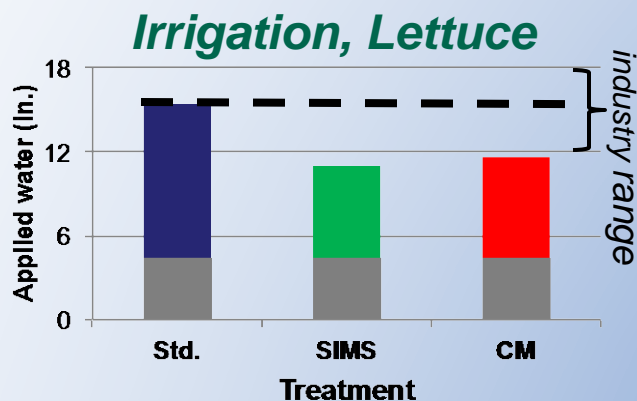
- 3 tmts, 5 reps, block randomized design
- Total area: ~1.4ac (0.57 ha)
- Two years of data: 2012 & 2013

PI: Lee Johnson; Co-I: Michael Cahn
 Collaboration with UCCE, USDA ARS,
 Fresh Express, Tanimura & Antle

Yield Trials: Results to Date

- Results to date confirm savings in applied water of 22-33% without reductions in yield or quality

■ Standard practice
■ SIMS
■ CropManage





Next Steps

1. Yield vs irrigation trials at demonstration sites with interested growers → results for lettuce and broccoli encouraging
2. Completion of API for integration with CropManage, Vineyard Soil Irrigation Model (VSIM), and other irrigation scheduling tools
3. Development of additional data interfaces
 - CSV/Excel?
 - Field summaries for mobile devices (key stats and satellite imagery)?
 - Are crop coefficients and ET enough, or are irrigation system run times required?

API for Integration with Other Web-based Tools

CropManage

[Planting Home](#)[Ranch Home](#)[Edit Ranch](#)[Ranch List](#)[Site Administration](#)[Help](#)**Ranch/Field:** UCCE Ranch 3, Lot 2, sandy loam**Planting:** romaine 2, 10.0 acres**Crop:** Romaine 2 row, 40 inch bed, 6/4-8/10/13

Irrigation Summary

[Show / Hide Columns](#)[Reset Column Order](#)[Show Previous Columns](#)[Show Next Columns](#)

Water Date	Irrigation Method	Recommended Irrigation Interval (days)	Recommended Irrigation Amount (inches)	Recommended Irrigation Time (hours)	Irrigation Water Applied (inches)	Kc	Canopy Cover (%)	Average Reference ET (inches/day)	Total Crop ET (inches)
6/4/13	Germination Sprinkler	N/A	N/A	N/A	0.75 in	0.00	0	0.00	0.00
6/5/13	Germination Sprinkler	1.6	0.22 in	0.72 hrs	0.45 in	1.00	0	0.14	0.14
6/7/13	Germination Sprinkler	1.9	0.36 in	1.18 hrs	0.30 in	0.70	0	0.17	0.23
6/9/13	Germination Sprinkler	1.7	0.39 in	1.29 hrs	0.45 in	0.70	0	0.18	0.25
6/12/13	Sprinkler	3.1	0.28 in	0.95 hrs	0.30 in	0.48	1	0.15	0.21
6/16/13	Sprinkler	2.9	0.40 in	1.33 hrs	0.45 in	0.37	1	0.20	0.30
Totals			1.64 in	5.47 hrs	2.70 in				1.13 in

[New Watering](#)[View Rainfall Data](#)[First](#) [Previous](#) [1](#) [Next](#) [Last](#)

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All

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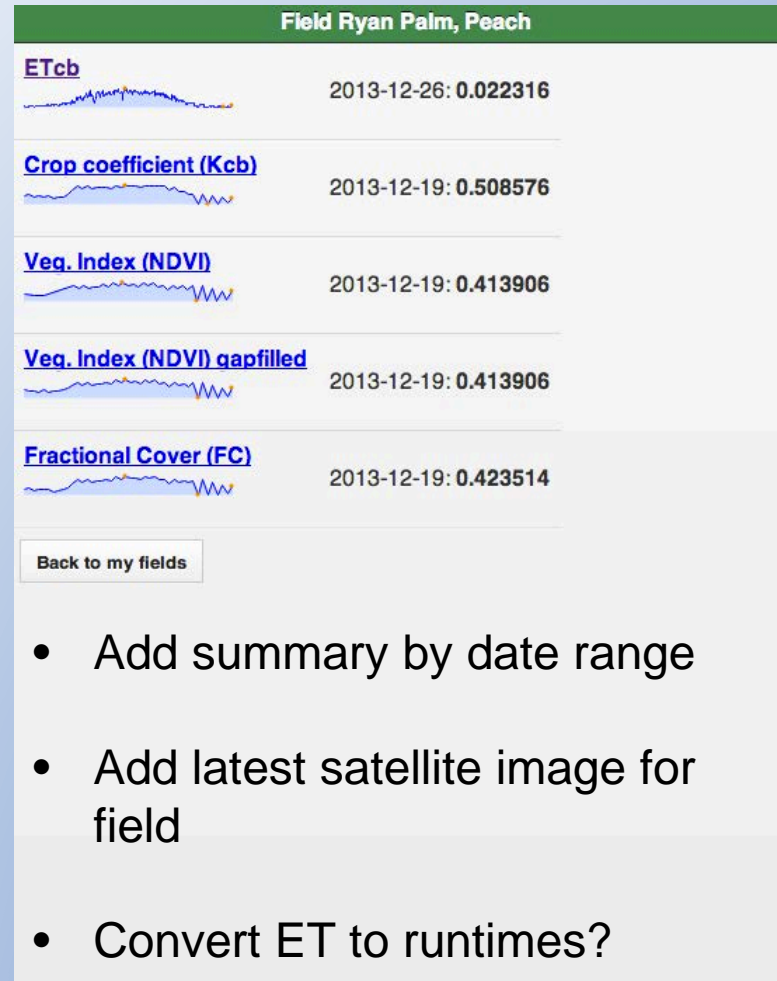
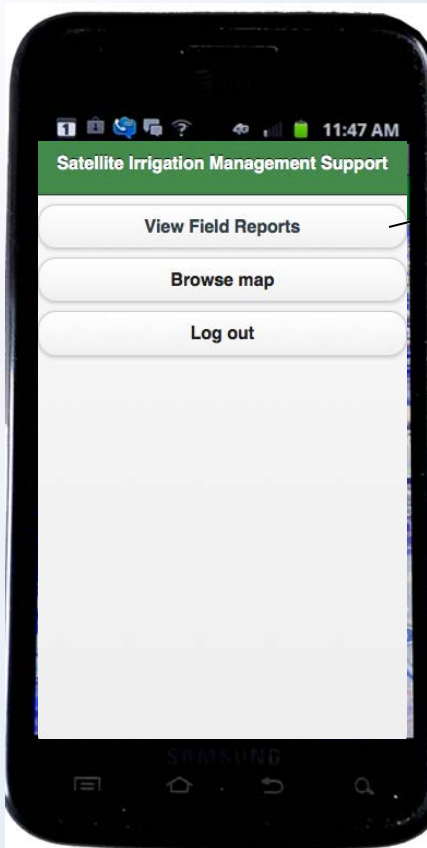


Automated Daily Summaries for Individual Fields/Lots/Blocks/Ranches

Mean Evapotranspiration

Date	Block Name							
	001-01	001-02	001-03	001-04	001-05	001-06	001-07	001-08
2014-01-01-00	0.012044	0.00799	0.014516	0.017353	0.017395	0.010055	0.013572	0.013572
2014-01-02-00	0.01126	0.007469	0.013571	0.016223	0.016262	0.009401	0.012688	0.012688
2014-01-03-00	0.011418	0.007574	0.013761	0.016451	0.01649	0.009532	0.012866	0.012866
2014-01-04-00	0.010703	0.0071	0.0129	0.015421	0.015457	0.008936	0.012061	0.012061
2014-01-05-00	0.013896	0.009218	0.016748	0.020021	0.020069	0.011601	0.015659	0.015659
2014-01-06-00	0.011302	0.007497	0.013621	0.016283	0.016322	0.009436	0.012735	0.012735
2014-01-07-00	0.010154	0.006736	0.012238	0.014629	0.014664	0.008477	0.011442	0.011442
2014-01-08-00	0.012152	0.008061	0.014646	0.017508	0.01755	0.010145	0.013693	0.013693
2014-01-09-00	0.013172	0.012813	0.008339	0.024133	0.015088	0.01341	0.010982	0.016723
2014-01-10-00	0.017201	0.016732	0.010889	0.031515	0.019703	0.017511	0.014342	0.021839
2014-01-11-00	0.011829	0.011506	0.007488	0.021673	0.01355	0.012042	0.009863	0.015018
2014-01-12-00	0.01158	0.011264	0.007331	0.021217	0.013265	0.011789	0.009655	0.014702
2014-01-13-00	0.01193	0.011605	0.007553	0.021858	0.013666	0.012146	0.009947	0.015147
2014-01-14-00	0.012204	0.011872	0.007726	0.022361	0.01398	0.012425	0.010176	0.015495
2014-01-15-00	0.014323	0.013933	0.009068	0.026243	0.016407	0.014582	0.011942	0.018185
2014-01-16-00	0.014937	0.01453	0.009456	0.027368	0.017111	0.015207	0.012454	0.018965
2014-01-17-00	0.019621	0.012992	0.013451	0.029915	0.017275	0.017275	0.02506	0.02346
2014-01-18-00	0.019687	0.013036	0.013496	0.030015	0.017333	0.017333	0.025144	0.023538
2014-01-19-00	0.019485	0.012902	0.013358	0.029708	0.017155	0.017155	0.024886	0.023297
2014-01-20-00	0.019709	0.013051	0.013512	0.030049	0.017352	0.017352	0.025173	0.023565

Mobile Interface for Irrigators?





Questions

- 1) What tools are growers currently using to schedule irrigation?
- 2) With training support, is there capacity to move beyond hard copy irrigation schedules?
- 3) Is ET sufficient, or are irrigation run-times required?
- 4) Is it better to target tools toward irrigators or irrigation consultants and growers?
- 5) Are new tools needed, or is integration with existing or emerging tools a better strategy?
- 6) Other advice or recommendations?



Project Team

**Forrest Melton, Lee Johnson, Kirk Post, Alberto Guzman, Carolyn
Rosevelt, Gwen Miller, Aimee Teaby, Andrew Michaelis,
Petr Votava, Rama Nemani
CSU Monterey Bay / NASA ARC-CREST**

Kent Frame, Bekele Temesgen, CA Dept. of Water Resources

Partners:

**CA Dept. of Water Resources, Western Growers Association, Center
for Irrigation Technology / CSU Fresno, USDA ARS / NRCS, Univ. of
California Cooperative Extension, USGS, Booth Ranches, Chiquita,
Constellation Wines, Del Monte Produce, E & J. Gallo, Farming D,
Fresh Express, Pereira Farms, Ryan Palm Farms, Tanimura & Antle**

***Interagency and public-private partnerships are
critical to addressing major water management
challenges in California.***



Thank you



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