#### **Comparing Methods to Estimate Consumptive Use in the Sacramento-San Joaquin Delta: Preliminary Finding**

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## **Motivations**

- Area of critical importance
- Water rights administration, management and operations, agricultural water management, and environmental and water quality protection
- Timely, consistent, costeffective, spatial ET estimate with known uncertainties



## **Objectives**



- Evaluate approaches to estimate evapotranspiration (ET) in the Delta
- Quantify uncertainties in ET mapping
- Calibration of models to improve consumptive use information
- Improve transparency and accessibility



## **CIMIS for reference ET**



- Currently manages over 145 active weather stations throughout the state
- Spatial CIMIS at 2km



Daily 2km  $ET_0$  on 10/20/2015

#### **Crop Coefficient Based Approach**

### • $ET = ET_0 * K_c$

- Reference ET<sub>0</sub> (well-watered alfafa / grass)
- Adjusted by specific crop coefficient (K<sub>c</sub>)
- Crop coefficient (K<sub>c</sub>) varies with crop structure and environmental conditions (relative humidity and wind)
- Challenges: spatial and temporal dynamics of Kc

### **Crop coefficients**

• Land cover type based crop coefficient (Kc)

- <u>California Simulation of Evapotranspiration of Applied Water</u> (CalSIMETAW): Published Kc values for each crop type but adjusted for local conditions (DWR)

- <u>Delta Evapotranspiration of Applied Water (DETAW)</u>: Kc calibrated with SEBAL (remote sensing based results from 2007 and 2009) (DWR)

- Remote sensing (RS) based Kc estimates
  - Relationship between  $\rm K_{c}$  and RS measures

- Calibrated with ground measurements across crop types and environmental conditions

- Satellite Irrigation Management Support System (SIMS): Normalized Difference Vegetation Index (NDVI) based Kc curve (NASA-Ames)

### **Energy Balance Based Methods**



$$\mathsf{ET} = \mathsf{R}_{\mathsf{n}} - \mathsf{G} - \mathsf{H}$$

R<sub>n</sub>: net radiation G: ground heat flux H: sensible heat

## **Energy Balance approaches**

- Mapping EvapoTranspiration at high Resolution with Internalized Calbiration (METRIC, Dr. Rick Allan, Univ. of Idaho)
  - Energy balance approach with internal calibration for H
    Cal-Poly ITRC-METRIC (Dr. Dan Howes)
- Disaggregate Atmosphere-Land Exchange Inverse (DisALEXI, Dr. Martha Anderson, USDA-ARS)
  - Two source energy balance model
- Semi-empirical Priestley Taylor (PT, Dr. Yufang Jin, UCDavis)

- Partitioning available energy to latent heat by parameterized PTcoefficient

## **Comparison Methods**

- 2014-2015 water year ET estimate
- Key input data
  - Land use survey (LandIQ)
  - CIMIS reference ET
  - Landsat satellite data (30m, every 16 day)
- Comparison among algorithms
  - By crop type, month, and regions
- Comparison with field measurements
  - Fallowed lands (2015)
  - 3 crop types (corn, pasture, alfafa)

### **Monthly Average Crop ET**



#### Almonds











### **Average Crop ET in July**









#### **Delta Total Crop ET**



Mean: 1,543 Thousand Acre-Feet in Crops for the Delta Service Area

#### Crop Evapotranspiration by DETAW Region



C Delta Service Area

#### **Model Dispersion**

	Oct	Nov	Dec	Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	Annual
Alfalfa	0.55	0.51	2.08	1.24	0.73	0.66	0.80	0.46	0.51	0.50	0.52	0.87	0.41
Almonds	0.62	0.66	1.47	1.84	0.88	0.84	0.79	0.70	0.71	0.88	0.93	0.87	0.66
Corn	1.01	0.67	1.25	2.15	0.49	0.43	0.97	1.14	0.42	0.40	0.43	0.80	0.30
Pasture	0.64	0.56	2.02	1.05	1.02	0.56	0.63	0.41	0.39	0.48	0.49	0.55	0.38
Potatoes	0.96	0.80	1.33	2.40	0.69	0.67	1.04	0.85	0.70	0.59	0.53	1.83	0.44
Rice	1.19	0.72	1.48	2.48	1.03	0.67	0.56	1.07	0.34	0.52	0.54	0.75	0.52
Tomatoes	0.65	1.09	1.35	2.24	0.72	0.64	0.81	0.78	0.87	0.58	0.64	1.94	0.48
Vineyards	0.56	0.68	1.25	1.94	1.18	0.87	1.32	1.19	0.91	0.94	0.90	1.36	0.82

Less More Dispersion Dispersion

#### Lessons of this Preliminary Blind Comparison

- Setting up the infrastructure
- Consolidation of datasets
- Various stages of development in models
- Land use information
- Delta particular conditions
  - Meteorological conditions: wind, fog, cloud, waterways
  - Limited clear-sky imageries in winter and spring
  - Limited CIMIS network stations



## **Preliminary Conclusions**

- The median estimates of Delta crop ET from the dry-run ensemble is broadly consistent with 2013 California Water Plan, ~ 1.5 MAF
- The greatest difference across methods occurs in December and January of the water year. Vineyards, potatoes and tomatoes have higher discrepancies.
- First round provides an initial reference for future comparisons, quantifying variation, and identifying conditions with higher discrepancies
- Improving quantitative understanding of CU in the Delta has the potential of increasing transparency and accuracy of models and reducing costs of water accounting statewide.

https://watershed.ucdavis.edu/project/delta-et



## Next steps

- Standardize common input datasets and refine comparison protocols
- Evaluation against field measured ET
- Sources of differences among various ET estimate approaches
- Calibration of ET approaches
- Final report: spring 2017

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# Extra slides

## Interim Report Overview

- Dry run of 7 ET estimation models
  - CalSIMETAW, DETAW, DisALEXI, ITRC-METRIC, SIMS, UCD-METRIC, UCD-PT
- Protocols and common datasets
- GitHub Repositories
  - https://github.com/ssj-delta-cu/ssj-overview
- Google Earth Engine platform
- Feedback and iteration, first draft 8/10
- Outcomes
  - Interim main meport
  - 9 supplemental appendices
    - Field campaign, methods, and full set of charts
  - https://watershed.ucdavis.edu/project/delta-et



## **Bare Soil Evapotranspiration**



Daily actual ET (ETa) measured from bare soil stations (surface renewal and eddy covariance) along with daily reference ET (ETo) from the nearby CIMIS stations. Lines are mean values across stations and gray shading represents one standard deviation from the mean.

## Bare Soil ET (mm/d)







ET from bare soil, Surface Renewal or ET stations versus methods in September

## CalSIMETAW

#### Daily soil water balance approach ETc = Kc\*ETo

- Daily ETo from SpatialCIMIS or further back to 1922 from Hargreaves-Samani Eq. (4x4 km grid => Mean for DAU)
- Published crop coefficients (Kc) but adjusted for local conditions
- Soils information and root zone depth for available water
- Precipitation is included
- User modified management allowable depletion is possible or default.
- Computes potential ETc and ETaw (ET of applied water)

# DETAW

Delta Evapotranspiration of Applied Water Daily soil water balance

- $ETc = Kc^*ETo$ 
  - Method tries to partition water supplied from seepage, applied water, precip.
  - Originally designed for potential ETc
  - Kc was calibrated based on SEBAL (remote sensing of actual ET similar to METRIC) results from 2007 and 2009 to better reflect actual stresses and "actual" ET (ETa)

## SIMS

Satellite Irrigation Management Support System ETc = Kc\*ETo

- NDVI Normalized Difference Vegetation Index (NDVI) based Kcb curve (basal crop coefficient)
- NDVI computed from LandSAT 5, 7, 8 Red and Near-Infrared Bands
- ETo using Spatial CIMIS
- Requires land use inputs and is typically considered a potential ET or ET assuming no stress.

## DisALEXI

Two-Source Model

#### Multiscale flux modeling system ALEXI – Two-Source Energy Balance (TSEB)

- Regional (5x5 km resolution)
- Daily energy balance
- Daily change/rise in morning temperature (GOES)
- Daily outputs at 8 or 4 km resolution over the US

#### DisALEXI – Disaggregation Algorithm

- Basically uses the ET results from the first scale (ALEXI) and sharpens it (partitions the ET) to higher resolution
- Partitioning of ET is based on surface temperature, leaf area index, and albedo products
- Final resolution is 30x30 meter



 $\Delta T_{RAD}$  - Geostationary T<sub>a</sub> - ABL model Landscape scal  $T_{RAD}$  - Landsat, MODIS  $T_a$  - ALEXI

- H is sensible heat•
- T is temperature •
- Ra is aerodynamic
  - resistance

Rx is bulk leaf resistance

- Rs is soil surface resistance
- Ta is temp at blending height

# **ITRC - METRIC**

Surface energy balance with corrections for aerodynamic

- Relies on LandSAT 5, 7, and 8
- Accurate crop type information is not needed
- Requires calibration ITRC uses a semiautomated calibration procedure
- Computes actual ET for satellite overpass uses
   ETo to compute that days actual Kc
- Cubic spline interpolation of Kc actual between image dates
- ITRC uses a corrected Spatial ETo
- Computes actual Kc and ETa (actual ET) accounting for stress

# UCD METRIC

Surface energy balance with corrections for aerodynamic

- Relies on LandSAT 5, 7, and 8
- UCD uses manual calibration
- Utilizes alfalfa reference evapotranspiration (ETr)
  - 2015 used single CIMIS station (Twitchell Island)
- Linear interpolation of Kcr between image dates
- Computes actual ET (ETa)

# **Priestley-Taylor UCD**

- Utilizes a combination of remotely sensed and ground based measurements.
  - LandSAT, MODIS, and SpatialCIMIS
    - For albedo, LAI, surface temp, air temp, solar radiation
  - PT coefficient computed using empirical function based on:
    - LAI, soil moisture, and temperature (still under development)
  - PT ETc for image date used to compute image date Kc
  - Interpolation between image dates using Spatial CIMIS ETo

#### ALEXI - The Atmosphere Land-Exchange Inverse model Co-I: Martha C. Anderson (USDA)



Coupling surface energy with ABL model to simulate air temperature T<sub>a</sub> at 50m Step 2: ET at high spatial resolution Downscaling ET at high resolution from step 1 using high resolution LST and VNIR

#### Landsat-thermal ET maps are being used for:

- purchase of water rights for endangered species and agreements with native American entities
- water rights management and regulation
- prediction of incidental ground-water recharge from surface irrigation
- quantification of water consumption during water rights litigation
- management of stream diversions for endangered species
- predictions of water consumption changes due to transition of land use from agriculture to city