



Workshop 105 – Ballroom E

June 2024

Retrieval and Application of On Demand Global Field-scale Actual Evapotranspiration Data Since 1982

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Overview of Remote Sensing Evapotranspiration

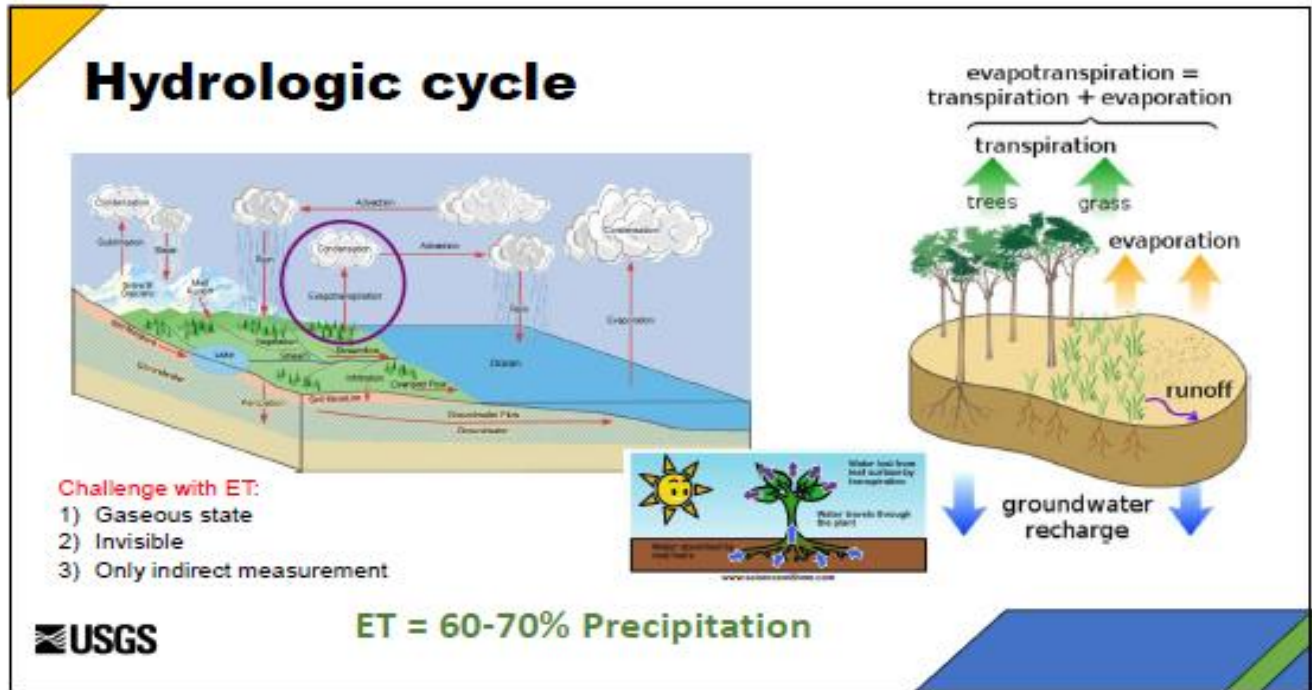
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¹U.S. Geological Survey (USGS)

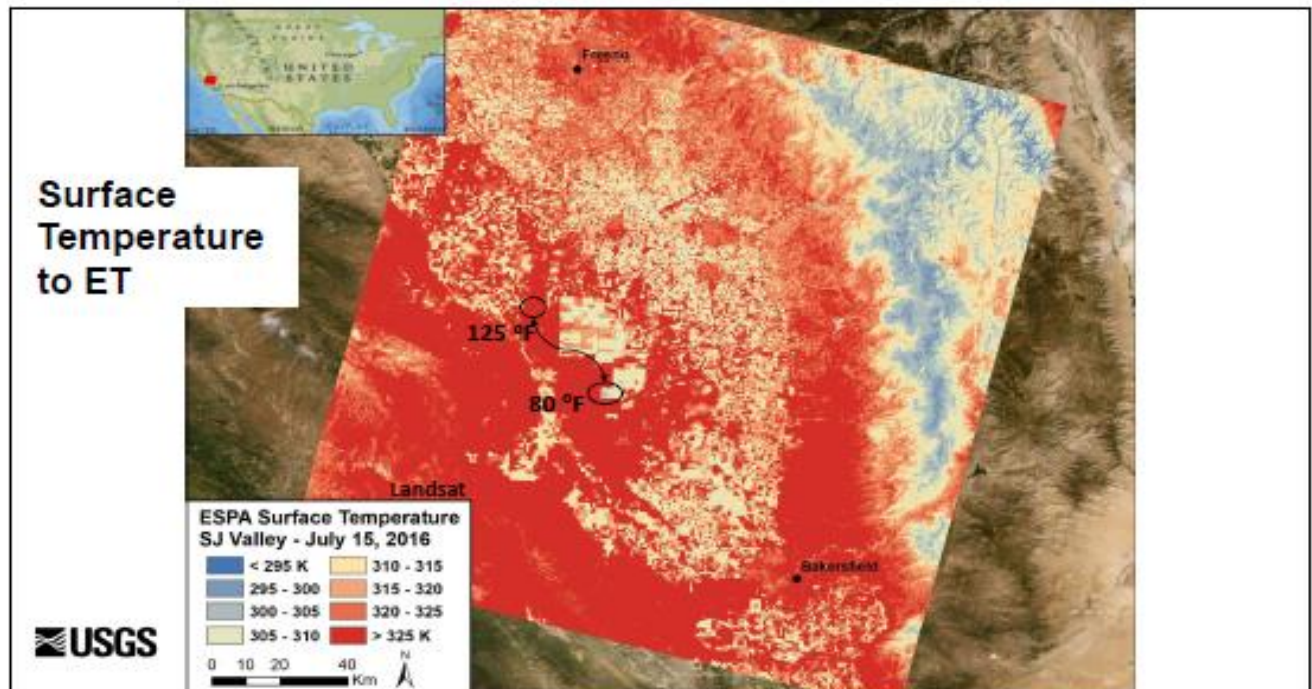
Earth Resources Observations and Science (EROS) Center,

²ASRC Federal, ³Innovate!, Inc., ⁴KBR, Inc., contractors to USGS EROS Center, Sioux Falls, SD 57198, USA.
Work performed under USGS Contract 140G0124D0001.

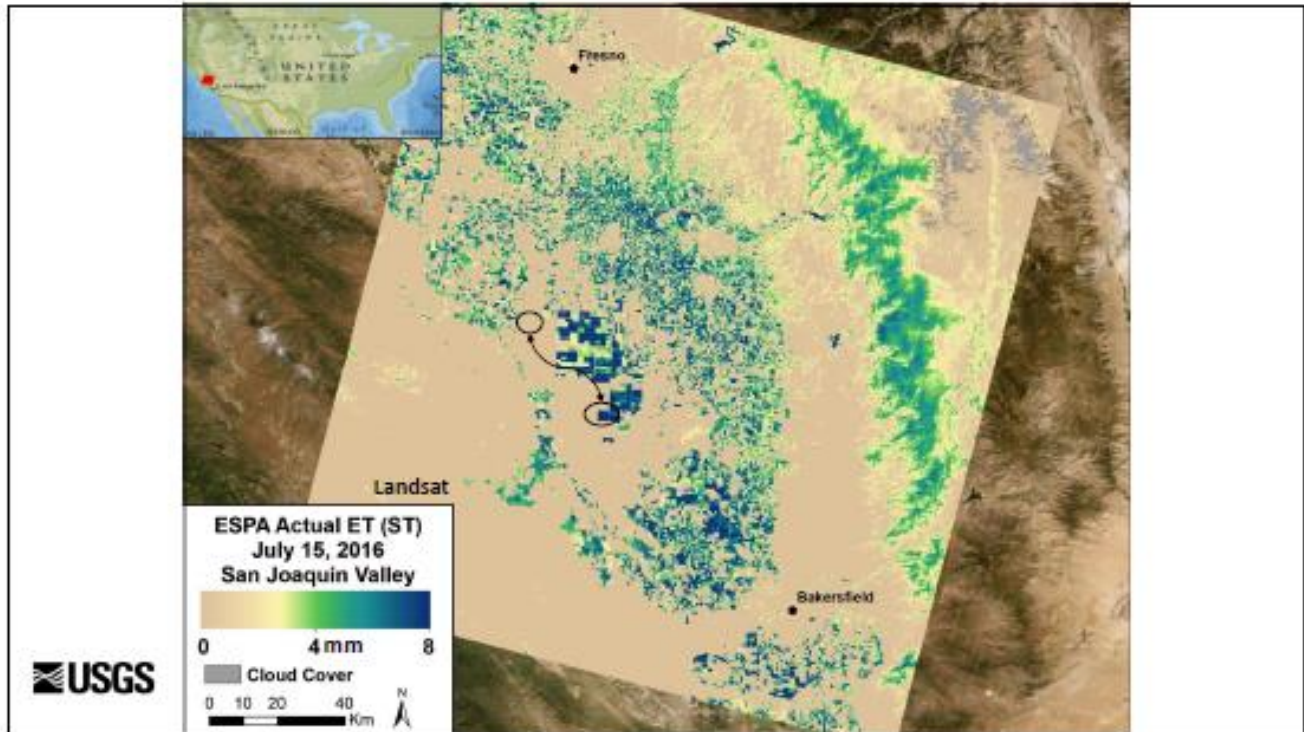
Overview of Remote Sensing Evapotranspiration



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ET Estimation in Agriculture...

- It is a **RESPONSE** variable as opposed to precipitation (driver)
- It reflects the integrated effects of energy/aerodynamics, soil moisture, vegetation, and environmental stress

Potential

Energy

Wind/RH




Limitations

Moisture

Vegetation

Env. Stress



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Challenge: ET under potential vs water limiting conditions

- Landscape is at different levels of stress; thus, actual ET is \leq potential

- Allen et al. (1998)

- **ET = $K_s * K_c * E_{To}$**

- K_c = type and stage of crop (~0.15 – 1.2)
- K_s = soil moisture stress factor (0 to 1.0)

(This requires knowledge of crop types, stage and moisture distribution.)



More direct estimation of stress using remote sensing approaches...

Land surface temperature (LST) derived from remotely sensed imagery can be used to estimate the combined effects of soil moisture and environmental stress factors on vegetation.

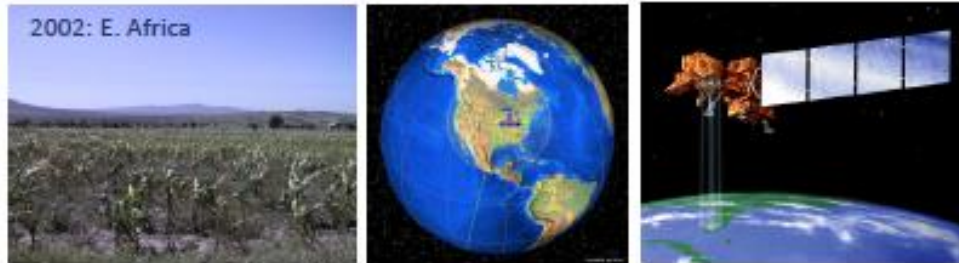
$$ET = ET_f * E_{To}$$

$K_s * K_c$

The diagram shows two yellow arrows pointing downwards from the term ET_f in the equation above to the expression $K_s * K_c$.



Satellite data: The Great Equalizer!



Global Monitoring using Satellite Data and Evapotranspiration Modeling



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Role of Remote Sensing: Input Data

- Land Surface Temperature (Energy Balance Method)
 - Landsat (~100m)
 - MODIS/VIIRS (1km)
 - AVHRR (1km)
 - GOES (10km)
- Precipitation Estimate (Water Balance Method)
 - NOAA NEXRAD (5km): US
 - METEOSAT RFE/CHIRPS (10km): Global
 - NASA TRMM, IMERG (25km), etc.: Global



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Several Approaches...

- Soil Moisture Modeling
 - Land Surface Models such as Noah, SWAT, VIC...
- Vegetation Index based
 - NDVI/LAI-based: MOD16, P-M, P-T
- Mixed Approach
 - NDVI-LST (Trapezoid, Triangle...)
- Surface Energy Balance
 - SEBAL/METRIC, SEBS, Two-Source, ALEXI, S-SEBI, SSEBop...



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SSEBop
Evapotranspiration

Background and Principles: "Satellite Psychrometry"

$$R_n = H + ET_a + G$$

$$ET_a = R_n - H - G$$

$$ET_a = R_n - H; G \sim 0 \text{ at daily time step}$$

$$ET_a = ET_f * ET_o / ET_r$$

$$ET_a = ET_o - \gamma^s (T_s - T_c) ET_o$$

Psychrometry: the science of measuring the water-vapor content of the air.

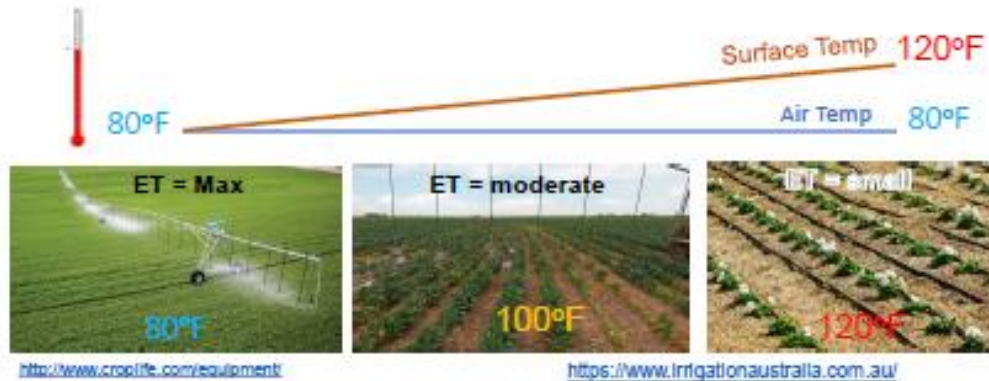
R_n = net radiation
 H = sensible heat
 G = ground heat flux
 ET_a = actual ET
 ET_o (ET_r) = reference ET (maximum)
 ET_f = ET Fraction (0-1.0)
 T_s = Land Surface Temperature (LST)
 T_c = wet reference boundary; f(T_s, γ^s, NDVI)
 γ^s = surface psychrometric constant; f(R_n, air density)



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SSEBop: ET Fraction

- Land surface temperature differences are used to measure landscape water use rates through the effect of evaporative cooling



$$ET_f = 1 - \gamma^s (T_s - T_c)$$

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Air vs. Satellite Psychrometry

$$ET_a = ET_o - \gamma^s (T_s - T_c) ET_o$$

Satellite Psychrometry

$$ea = es - \gamma (Td - Tw)$$

Air Psychrometry

$$\gamma = \frac{C_p P}{\epsilon \lambda} = 0.665 * 10^{-3} P$$

ea = actual vapor pressure (kPa)

es = saturated vapor pressure (kPa) at Tw

Td: dry bulb (ambient) air temp, °C⁻¹

Tw: wet bulb air temp, °C⁻¹

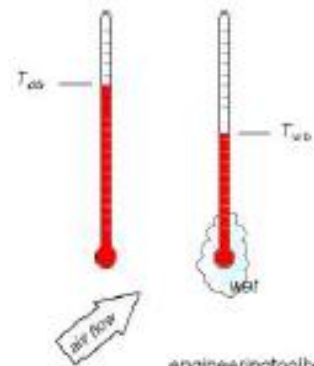
γ = psychrometric constant [kPa °C⁻¹]

P = atmospheric pressure [kPa]

λ = latent heat of vaporization, 2.45 [MJ kg⁻¹]

c_p = specific heat of air at constant pressure, 1.013 10⁻³ [MJ kg⁻¹ °C⁻¹]

ε ratio = molecular weight of water vapor/dry air = 0.622



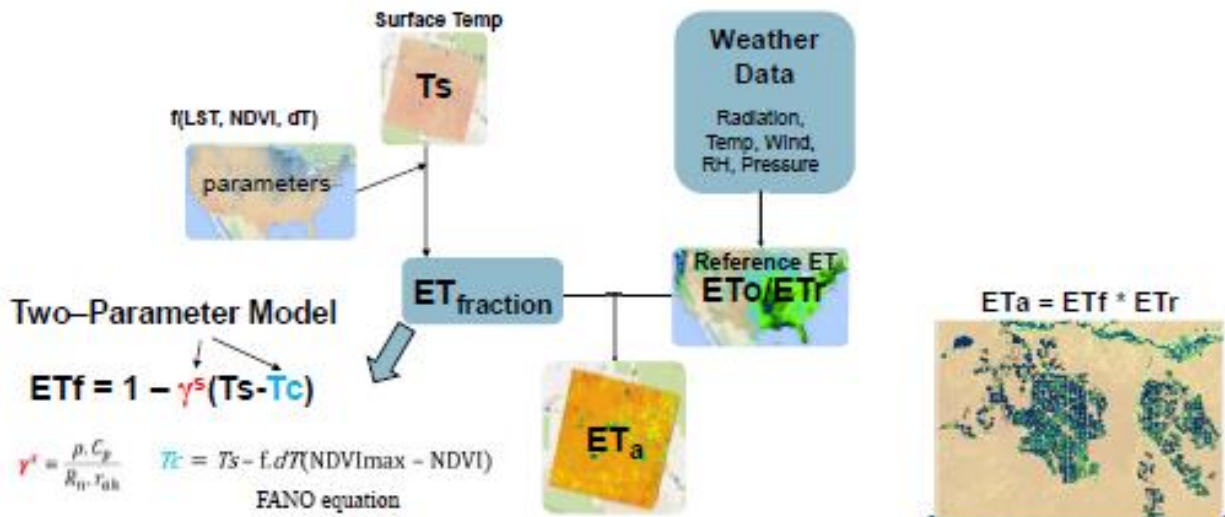
engineeringtoolbox.com



Ferrel, W.M. (1886); Allen et al. (1998)

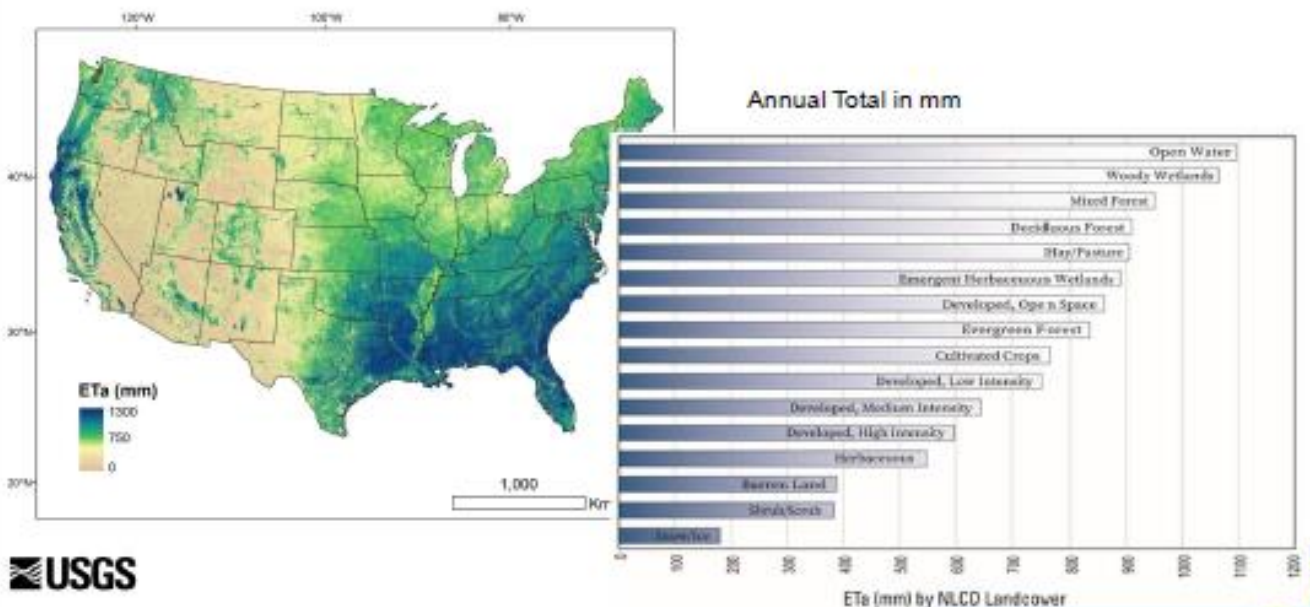
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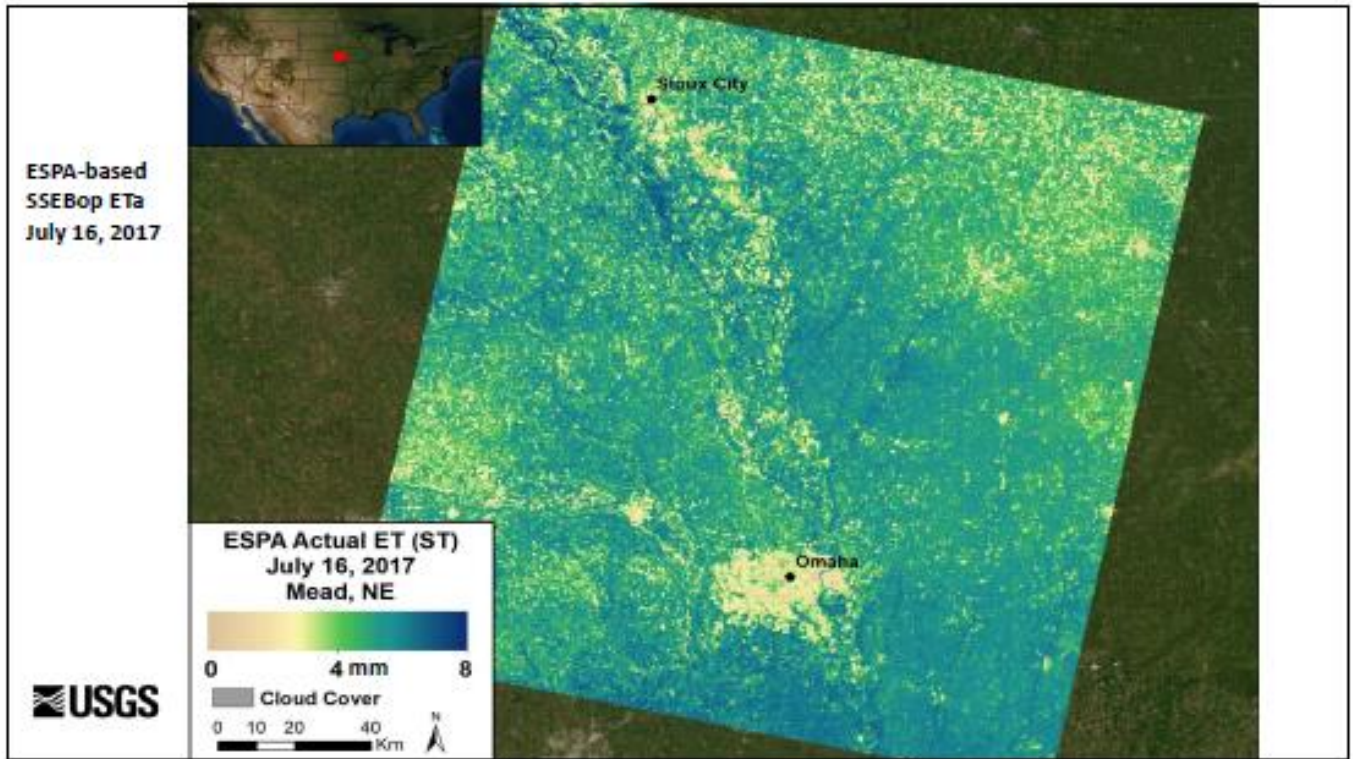
Operational Simplified Surface Energy Balance (SSEBop) Modeling Approach



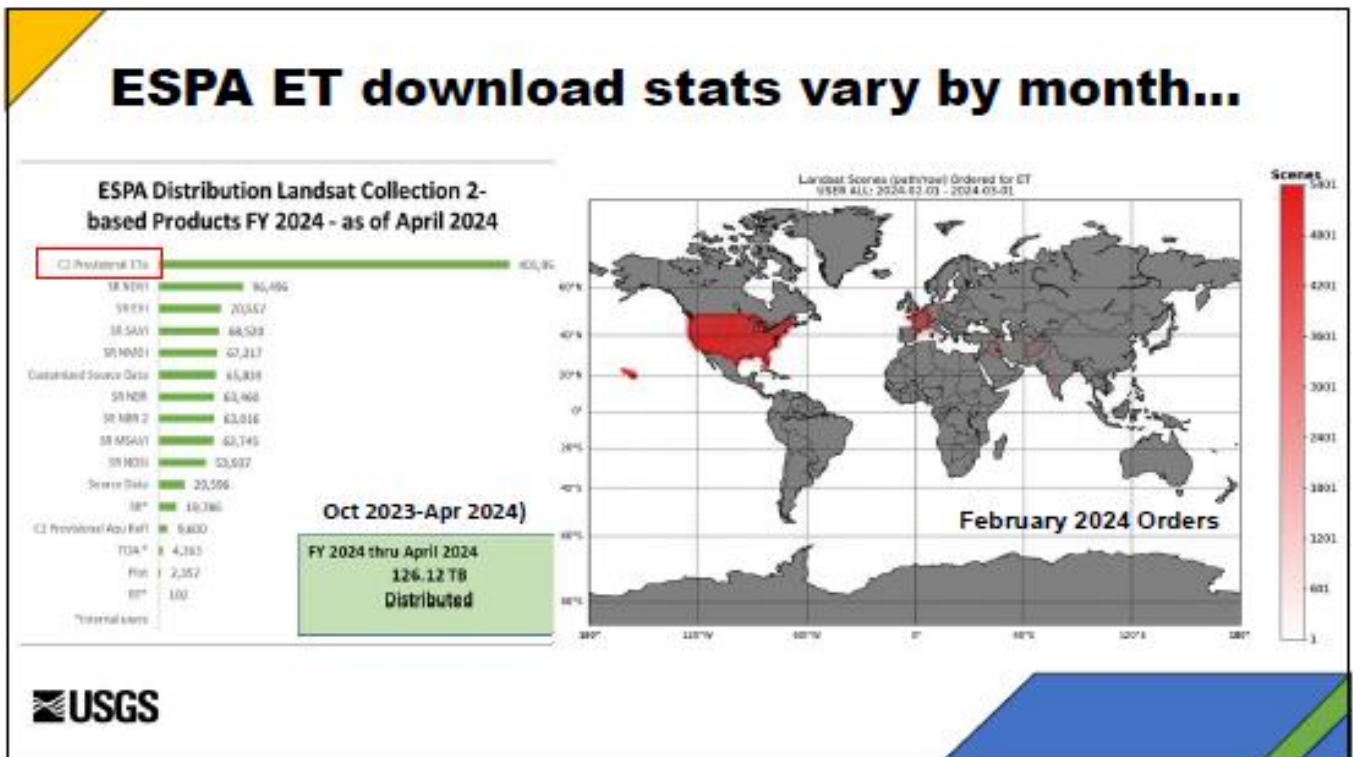
SSEBop: Senay et al., 2013 JAWRA; 2018 App. Eng. in Ag; 2023 RS

Landsat Scale CONUS ETa (SSEBop, 30 m)





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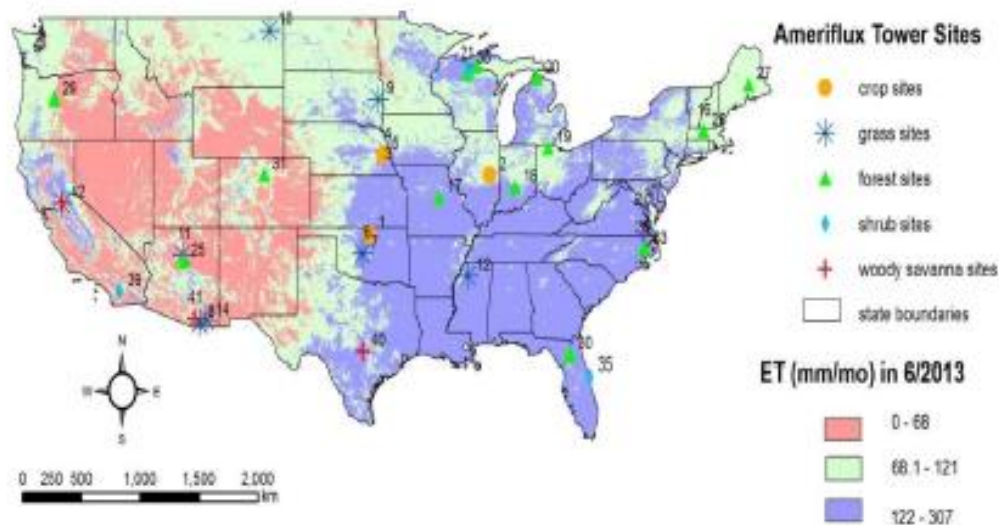
Model Performance Evaluation...

- Visual, qualitative spatial patterns
- EC (Eddy covariance) Flux Tower
- Basin Water Budget



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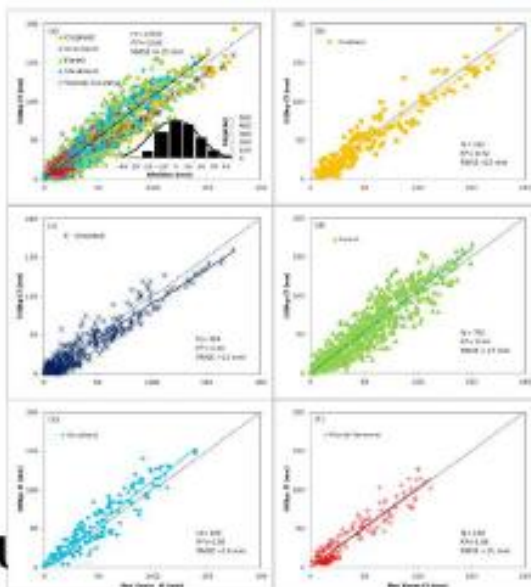
Validation with EC Flux Towers



42 Ameriflux tower stations (2001-2007) with five land cover types—crop, grass, forest, shrub and woody savanna. The background color represents the ET range for June 2013.

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Model validation with EC Flux Towers by cover type



MODIS-based

Comparison scatterplot between monthly ET (mm month^{-1}) from the SSEBop and the ET measurements by eddy covariance method across 42 Ameriflux tower sites during 2001 - 2007.

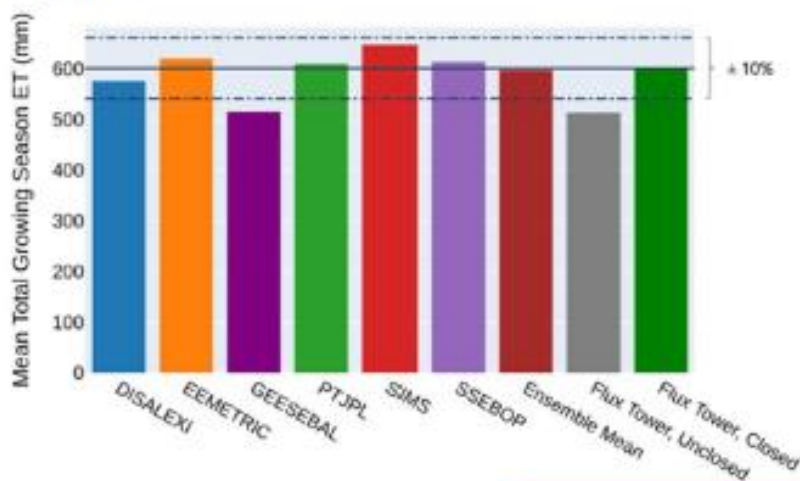
Overall model uncertainty is around 20% for monthly.

Chen et al., 2016 Journal of Hydrology

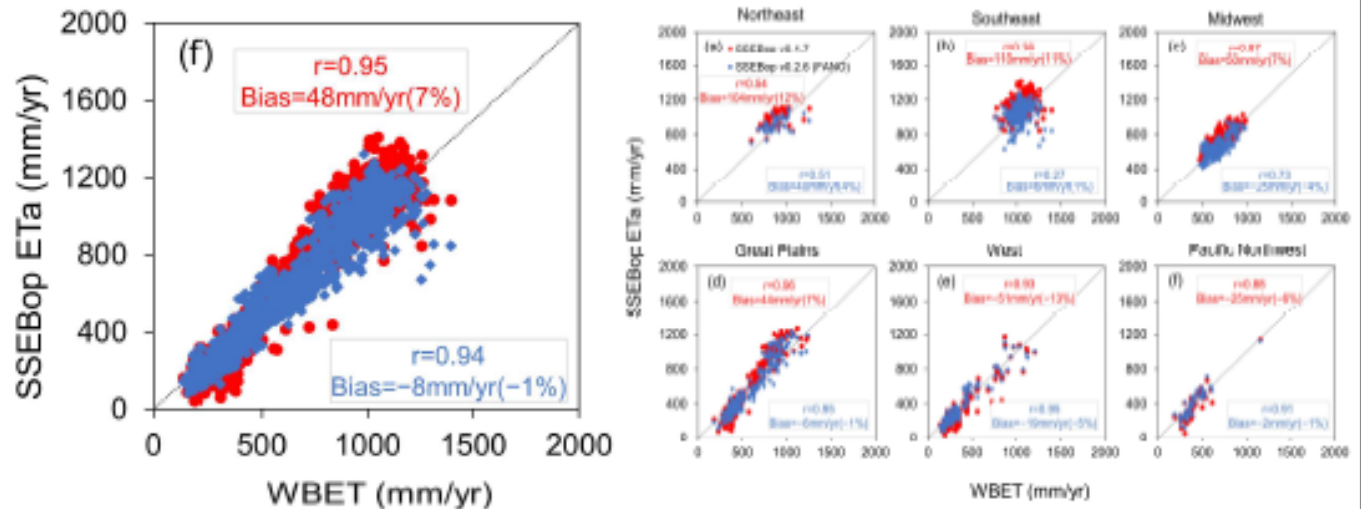
OpenET Phase I : Model Intercomparison

15 EC Flux Towers over Croplands

Total growing season weighted mean ET ($n = 15$ sites with 40 total growing seasons) for 6 satellite-driven ET models, the ensemble mean ET, and ET calculated from the closed and unclosed energy balances at each flux tower site.



Water Balance ET Evaluation (continued)



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Summary

- (Provisional) Landsat ETa is useful for field-scale water use mapping and historical (1982-present) analysis.
- Bias Correction: one-time bias correction using locally available observed data (water balance, EC flux tower) will improve the absolute accuracy.
- Operational global SSEBop ET is being generated using thermal imagery (MODIS/VIIRS/Landsat) and gridded weather datasets.

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