

Estimation of Seasonal Snow Water Equivalent Using Landsat Observations

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AGU Fall Meeting 2018

Washington DC, Dec. 10-14, 2018

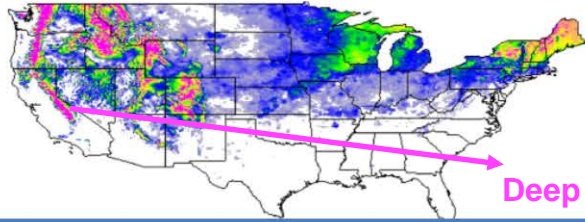
Snow is Biased in Reanalysis Datasets

OBSERVATIONS

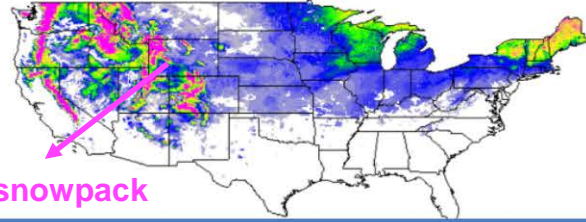
Panel a-b (mm)



a) UA Maximum SWE (mm)

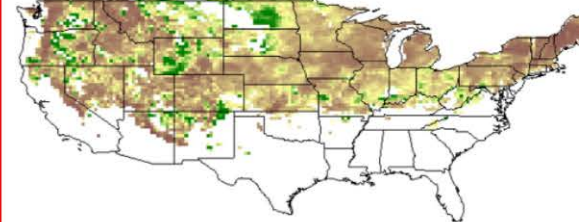


b) SNODAS Maximum SWE (mm)

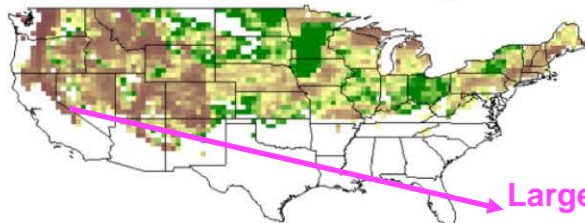


Broxton et al., (2016), JHM

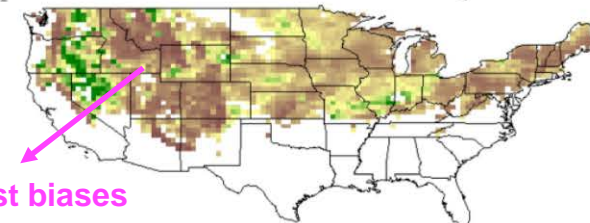
c) ratio(CFSR to UA)



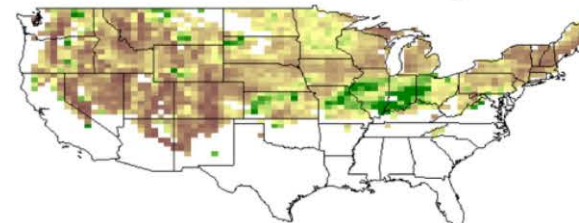
d) ratio(ERA-I to UA)



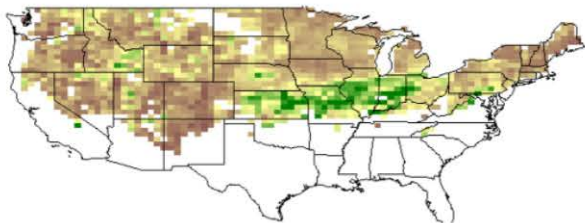
e) ratio(ERA-I/Land to UA)



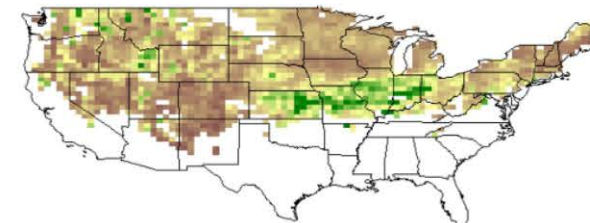
f) ratio(MERRA to UA)



g) ratio(MERRA -Land to UA)

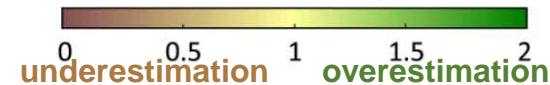


h) ratio(MERRA2 to UA)



REANALYSES

Panels c-h (-)



- Reanalyses are used to investigate snow processes [e.g., time/magnitude]
- But SWE is typically underestimated
- Larger biases in deep snowpack
- Biases partially explained by spatial resolution and snowfall biases

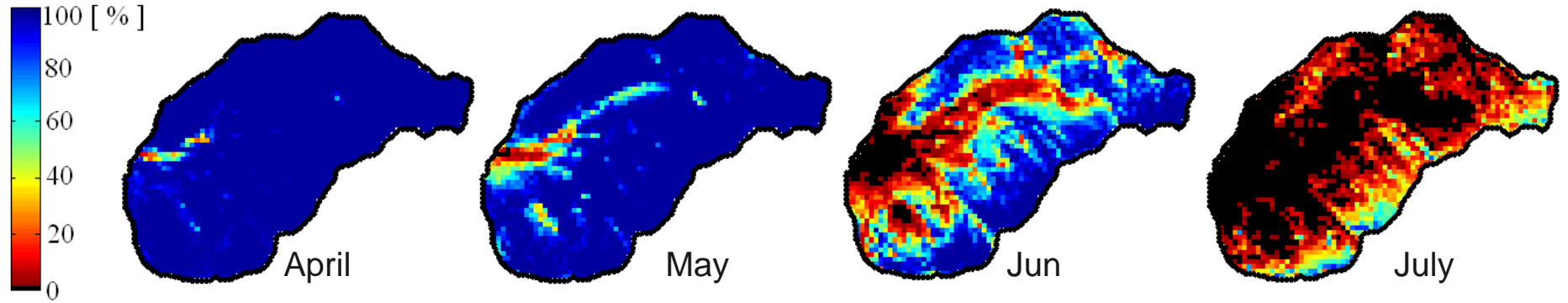
Need to provide unbiased reanalysis estimates of SWE

Presentation outline

- Motivations
- **A Method for Snow Reanalysis**
- Proof of Concept: Sierra Nevada Case
 - Validation
 - Climatology
- Conclusions

Snow Reanalysis Concept

Example FSCA depletion
(Tokopah Watershed, California)

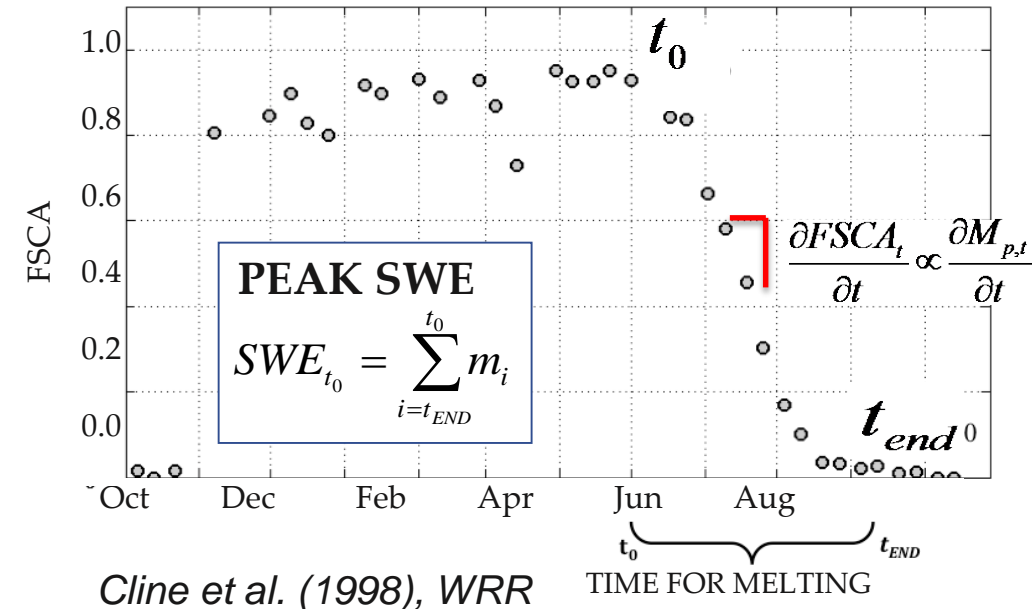


*Vis/NiR provides no direct estimate of SWE, but....

Reconstruction of SWE from:

- Depletion of fractional snow covered area [**FSCA**]
- Space/Time continuous energy fluxes
- SWE as a sum of melt (m_i) events

Use satellite observed FSCA to estimate SWE!!

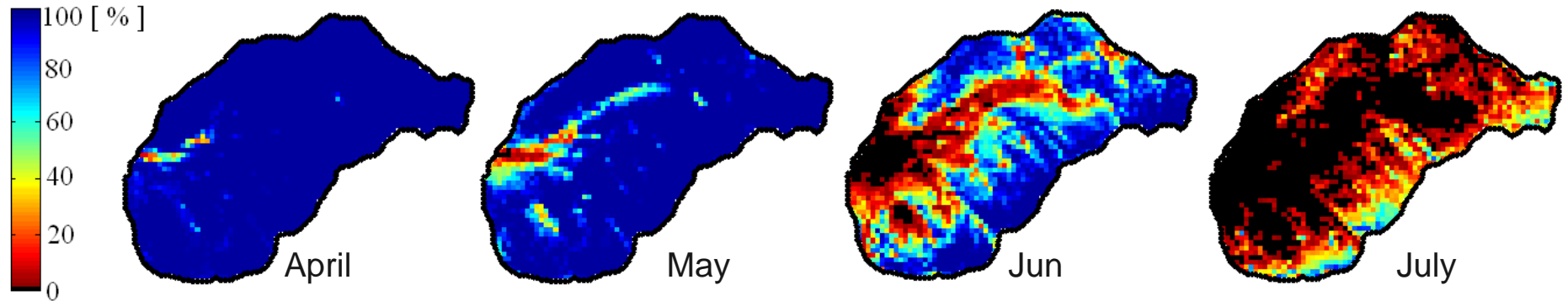


Giroto et al. (2014); HP

Cline et al. (1998), WRR

Snow Reanalysis Concept

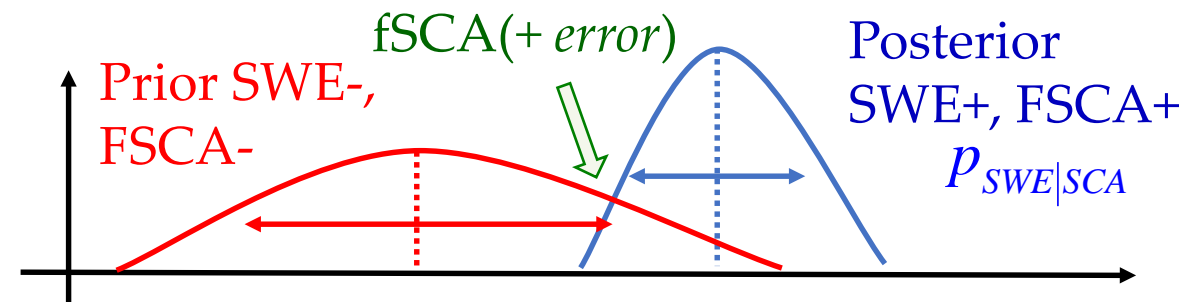
Example FSCA depletion
(Tokopah Watershed, California)



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Probabilistic Approach
(Ensemble Kalman Smoother, Particle Smoother)



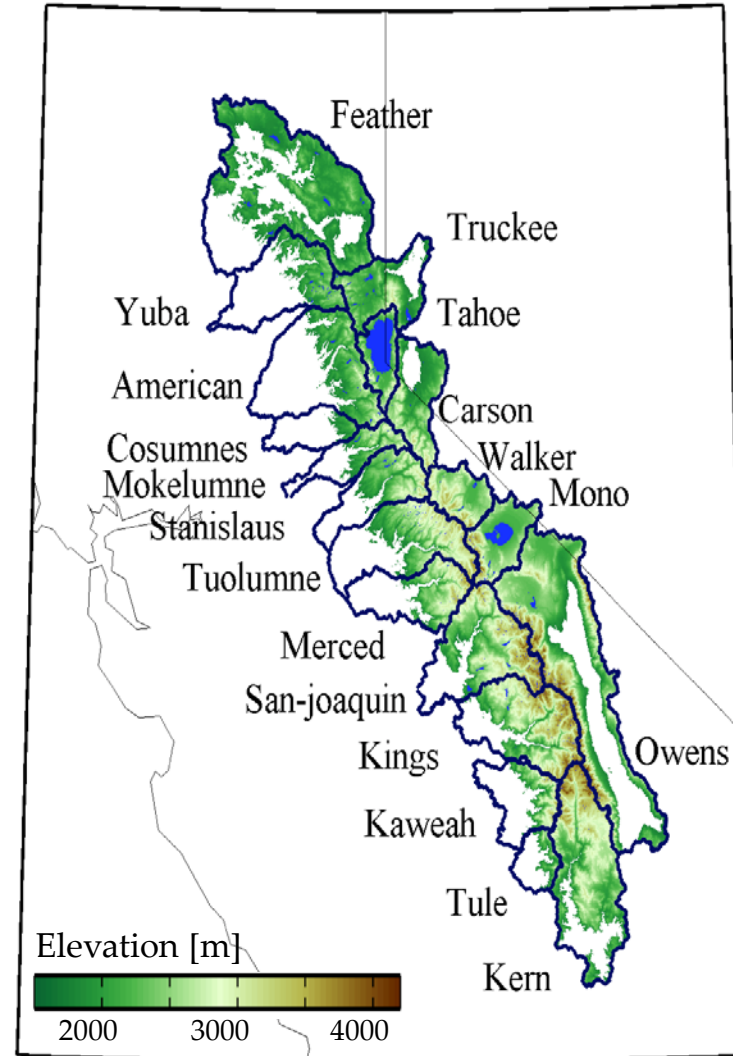
Giroto et al. (2014); HP

Presentation outline

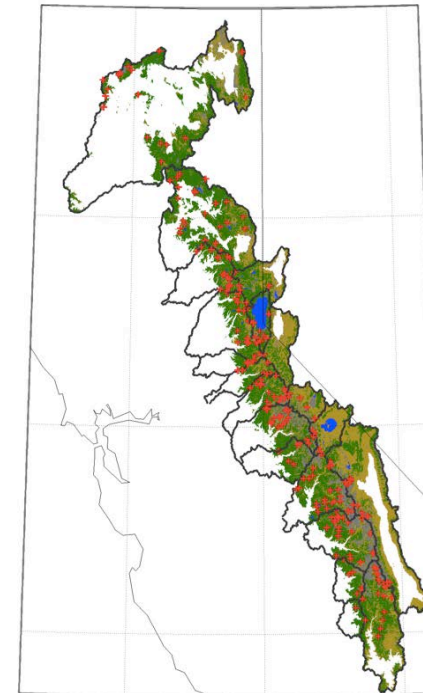
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The Sierra Nevada: Validation

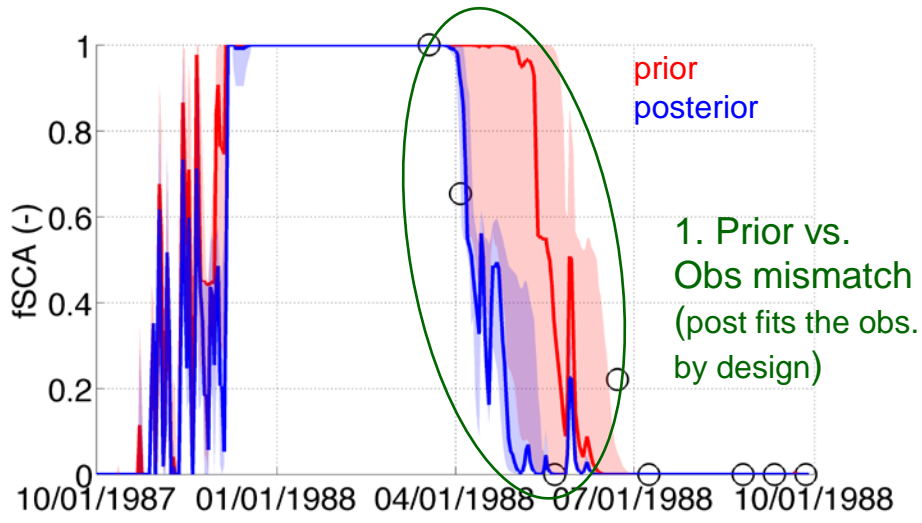
- Landsat observations (Landsat 5-8 record)
- Forcings: NLDAS
- Temporal Extent: **31 years**
- Spatial resolution: **90 m**
- Temporal resolution: **daily**
- Analysis: Particle Smoother
- Maritime snowpack (max. SWE ~1-2m)



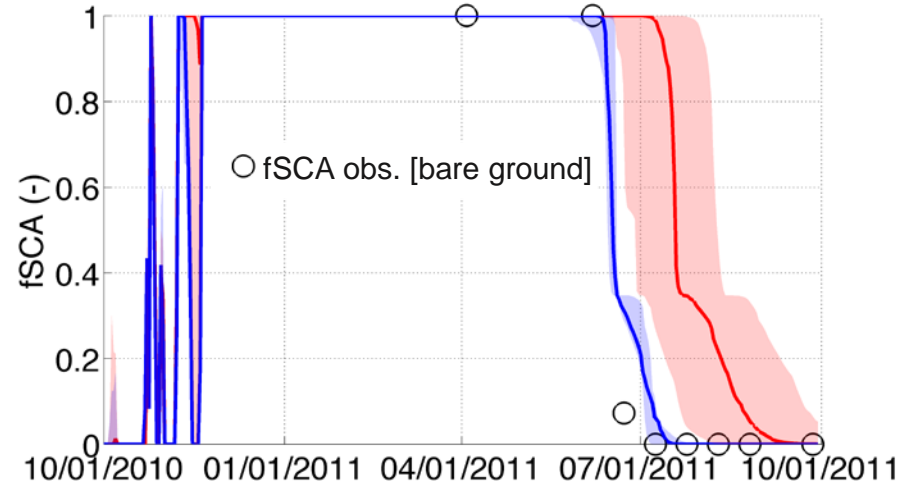
- Validation:
 - 108 snow-pillow
 - 202 snow-courses



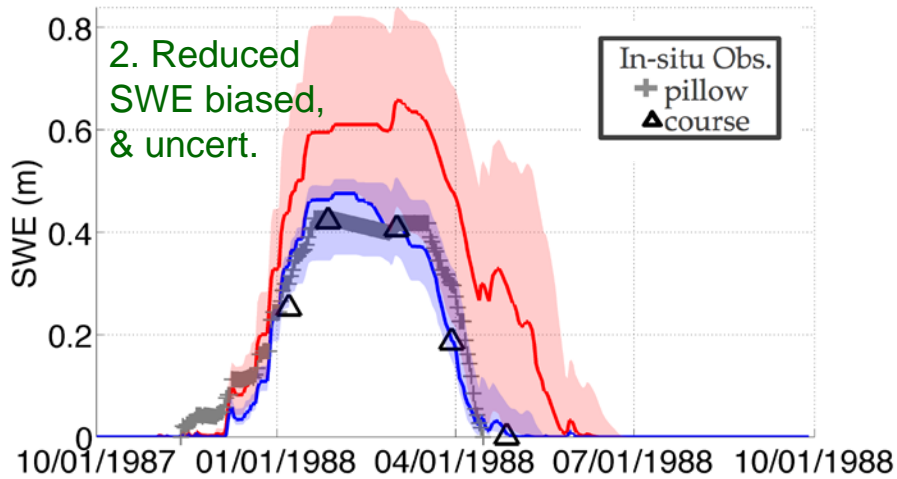
The Sierra Nevada: Validation



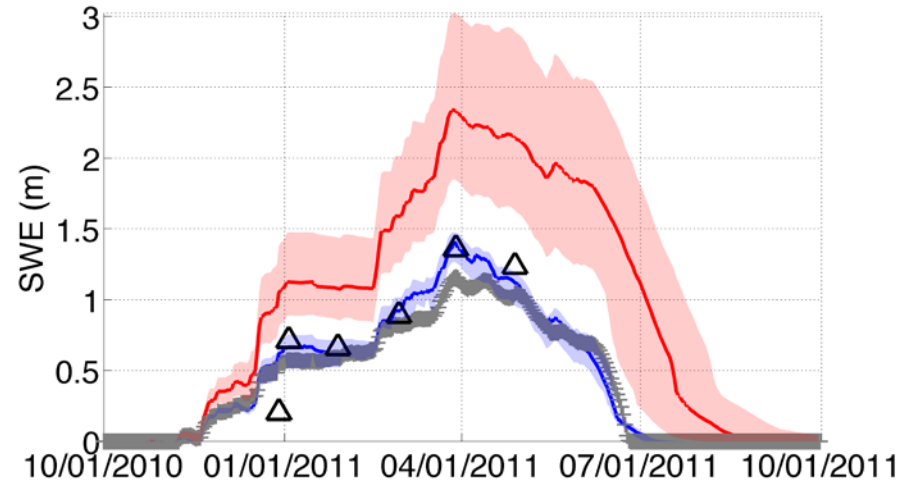
dry year



wet year

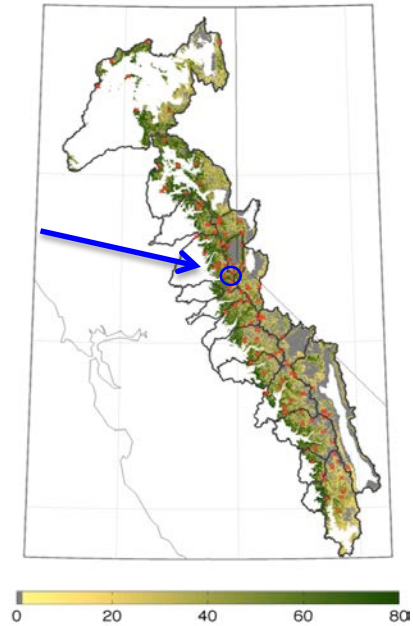


2. Reduced SWE biased, & uncert.



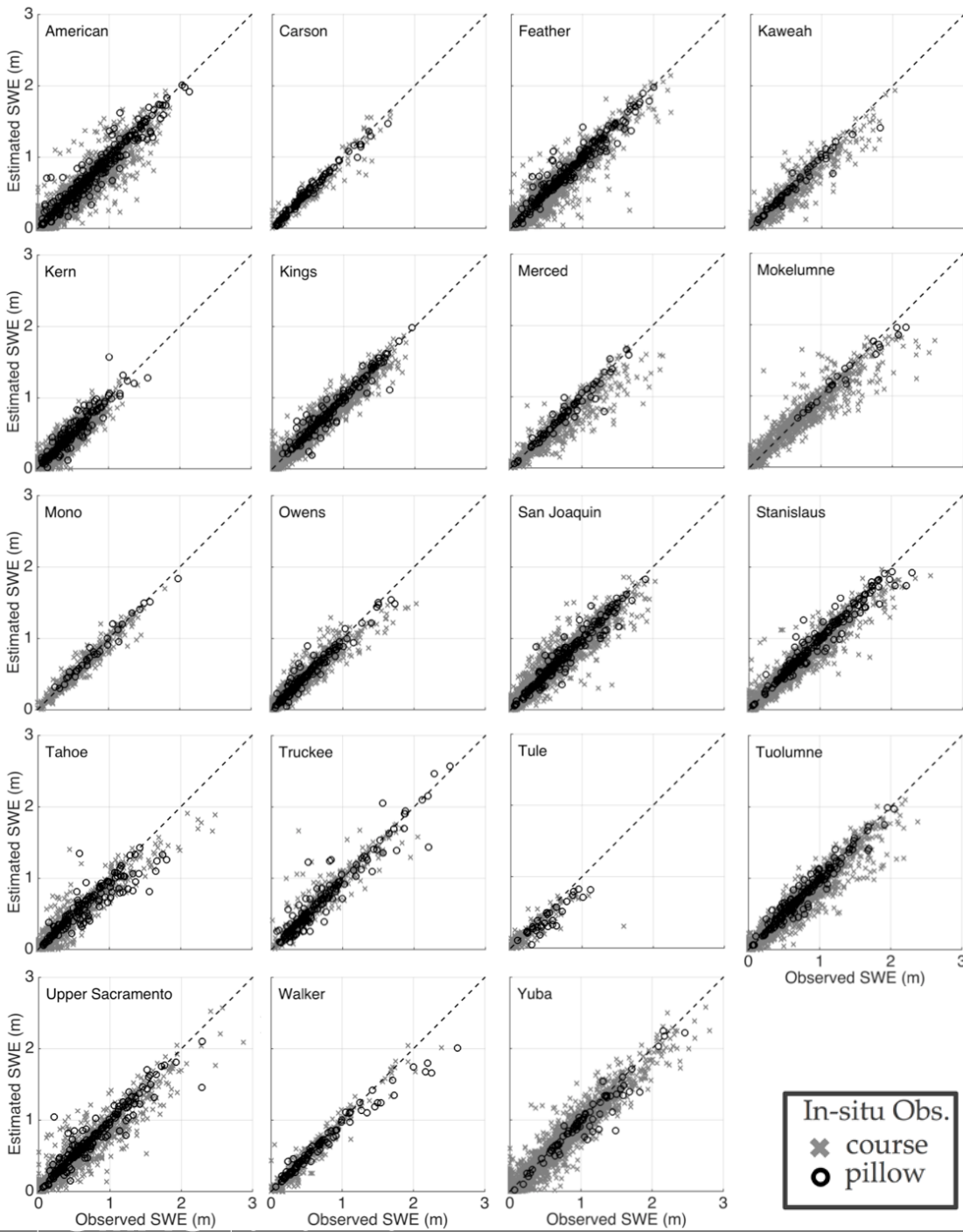
Example: American River Watershed:

- fveg = 52%,
- elev=2400 m;
- co-located pillow/snow course data



(Margulis et al. 2016; JHM)

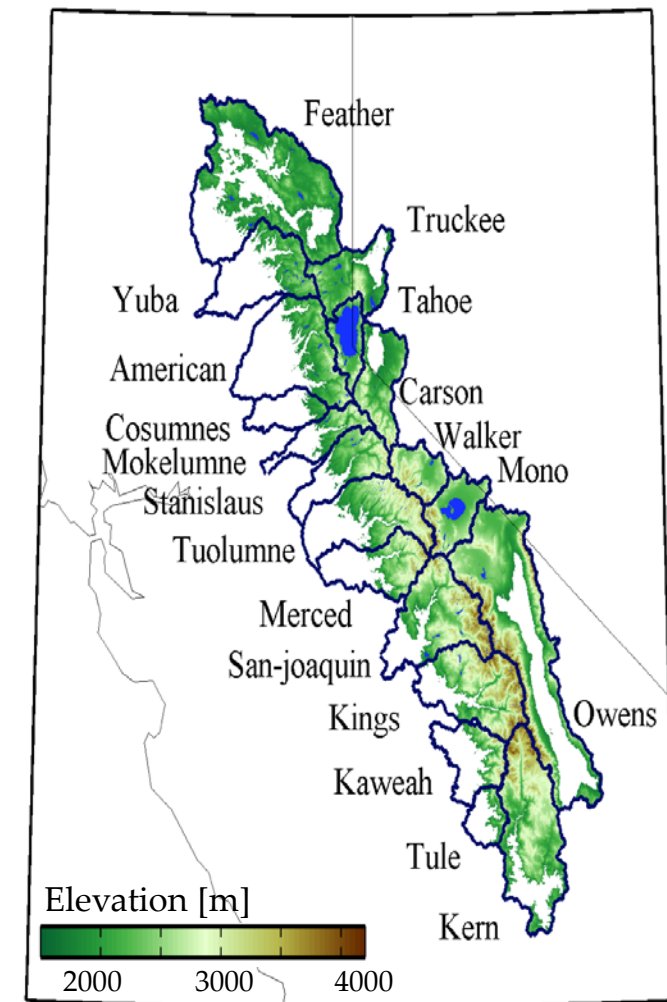
The Sierra Nevada: Validation



SWE estimates validated against >9000 station-years (snow pillow & snow course data)

SWE statistics show encouraging results:

- ME ~ -2 cm
- RMSE ~ 12 cm
- Corr. ~ 0.96



(Margulis et al. 2016; JHM)

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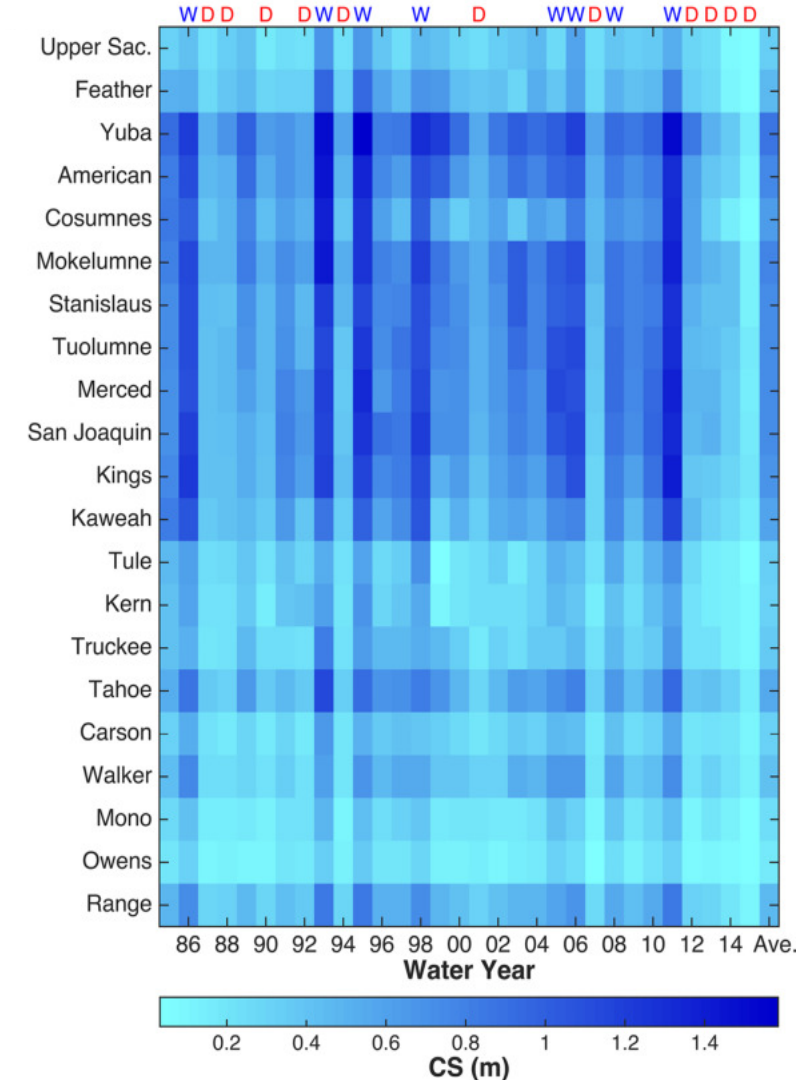
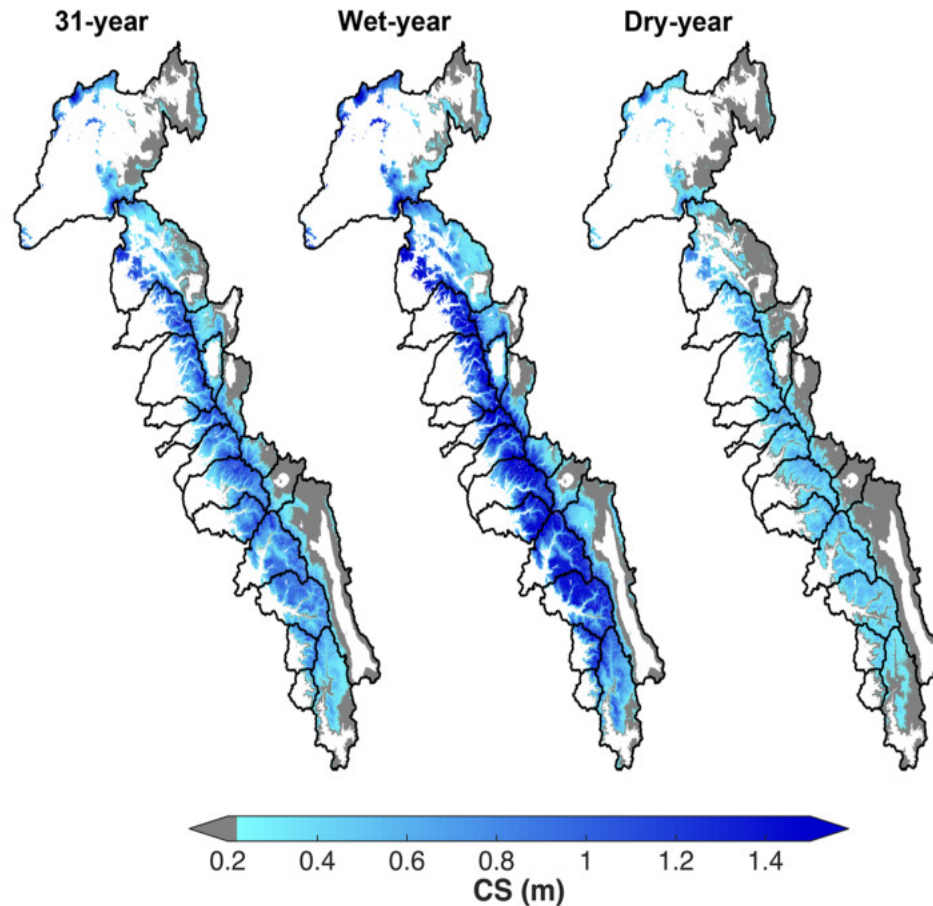
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The Sierra Nevada Example: Spatial Analysis

Cumulative Snowfall (CS):

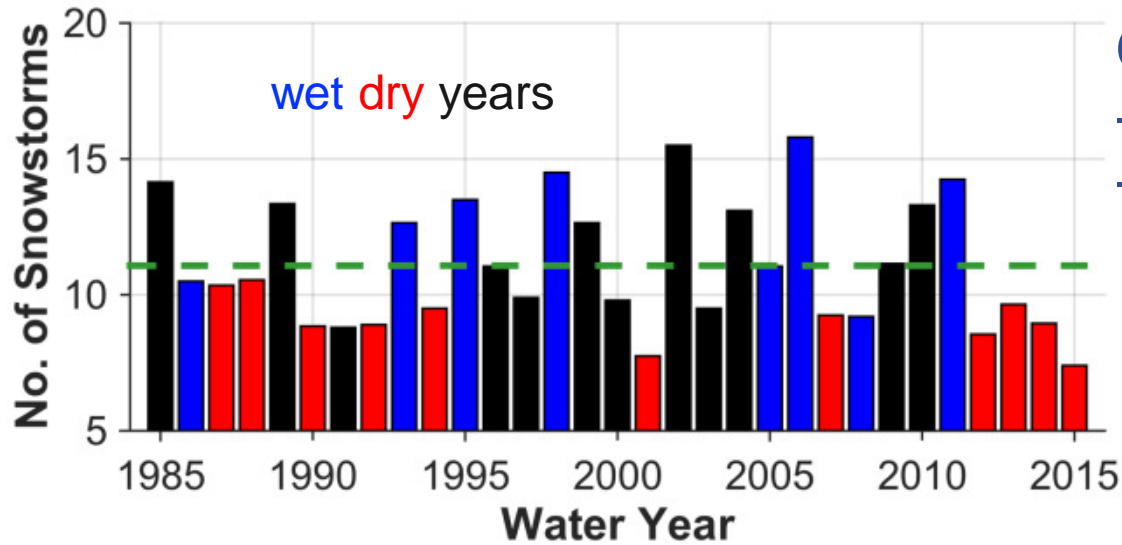
Accumulated increases in SWE (reanalysis)

- West accumulates more than East
- Higher elevations more CS
- Very high degree of spatial and interannual variability
- Sierra Nevada is a story of Wet/Dry Years



(Huning and Margulis 2017; WRR)

The Sierra Nevada Example: Temporal Analysis

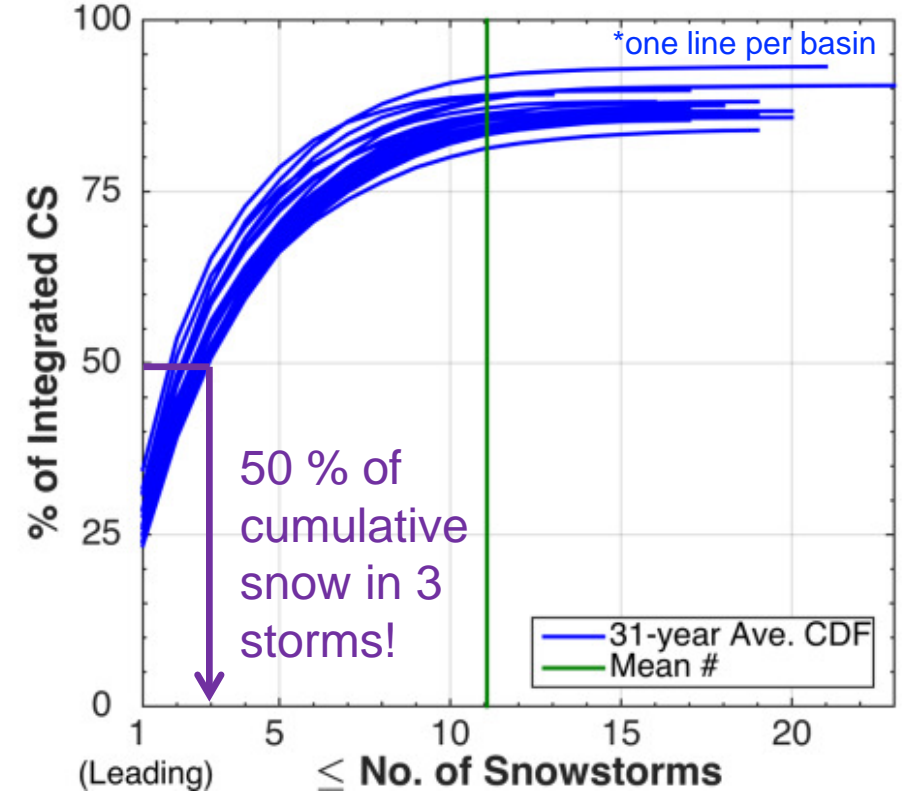


Climatology of Sierra Nevada snowstorms

- On average 11 snowstorms each winter
- More events for wet years (13) less for dry years (9)

Storm contribution to the total cumulative snow

- 50 % of the cumulative snow accumulates within 3 snow storms
- Each wintertime storm matters!
- The climatological rate of snowfall accumulation has a similar response over the entire Sierra Nevada range



(Huning and Margulis 2017; WRR)

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Conclusions & Future Directions

- This SWE reanalysis provides **unbiased** estimates of SWE even for **large snowpacks** (at least for the Sierra Nevada Mountains)
- SWE reanalysis provides a **unique** dataset in terms of large spatial/temporal extent, high spatial/temporal resolution, accuracy
- Climatology of the Sierra Nevada:
 - Higher cumulative snow for higher elevation, more cumulative snow in the west
 - Very high degree of spatial and interannual variability
 - Only a few storms to get the annual cumulative snow --> each storm is important
 - Coherence of events across the Sierra mountain range

Next/ongoing steps:

- Extend this method and analysis to other regions/longer times (e.g., Andes, High Mountain Asia, or in a context of a global reanalysis dataset)

Thanks!!!

Funding provided by:

- NASA Terrestrial Hydrology Program
- NASA Earth and Space Science Fellowship (NESSF)
- NSF Earth Sciences (EAR)