

**Thesis Defense
Jonathan Wagner**

**When: Oct. 30 at 1:00 pm
Where: Room 1715, M. Library**



**Evaluating the impact of dust on snowmelt timing in
Senator Beck Basin using a physically based and
spatially distributed snowmelt model informed by
in situ albedo observations**

Motivation

- The Colorado River is fed primarily by snow from the Colorado River Basin (CRB)
 - Supplies water to over 30 million people
 - Reservoirs are used to capture, store, and help manage water resources from the Colorado River
- Effectively managing water resources requires accurate forecasts of snowmelt timing and magnitude
 - Temperature based snowmelt forecasting in the CRB is complicated by dust radiative forcing (DRF)

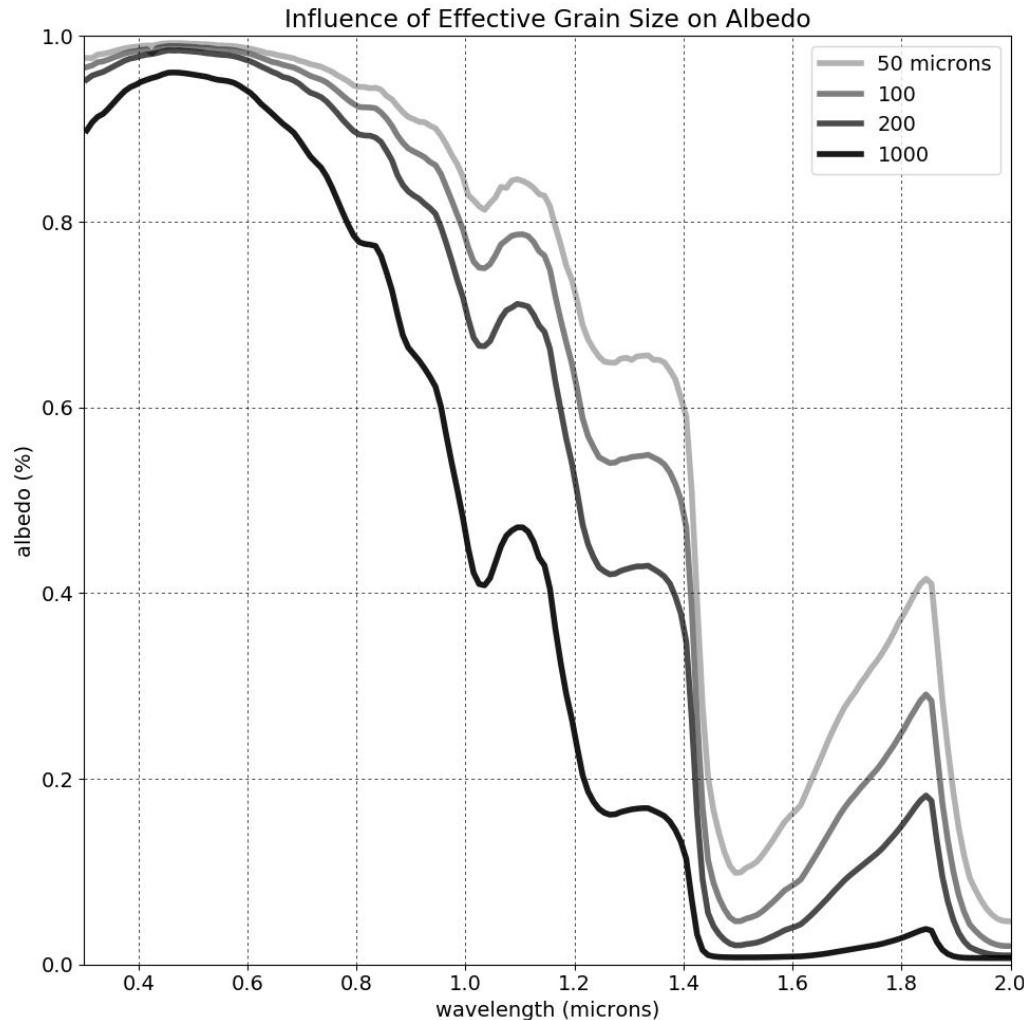
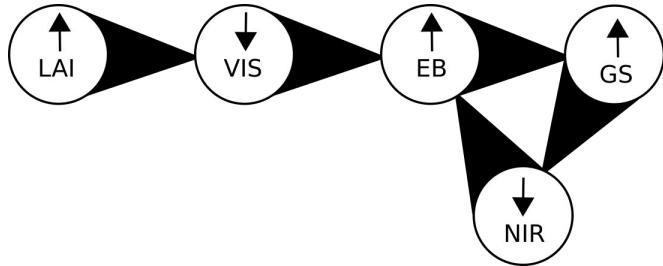
Dust loading in Senator Beck Basin



Images courtesy of CSAS

Dust Radiative Forcing

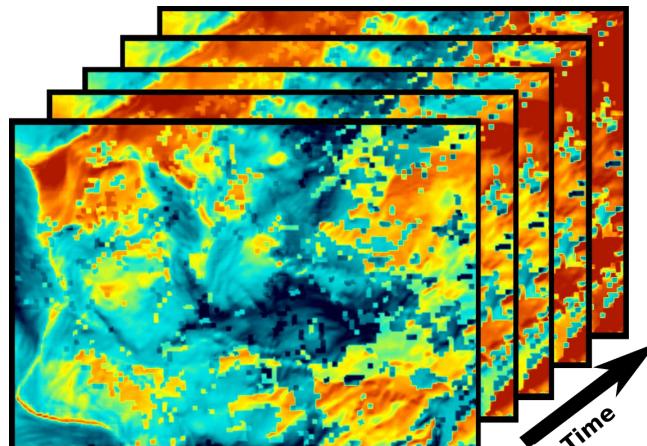
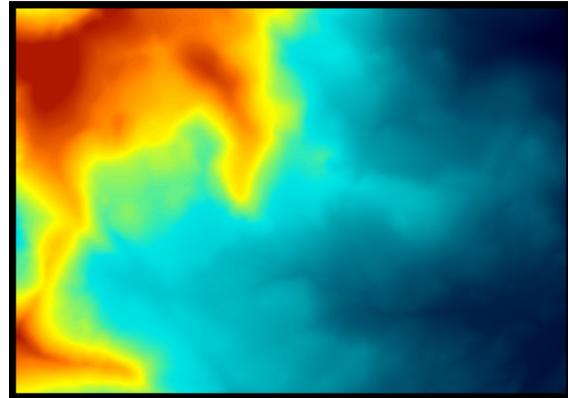
- Light Absorbing Impurities (LAI)
 - Primarily dust and black carbon
 - Decrease albedo in the visible wavelengths (VIS)
- Grain Size
 - Increases due to melt/refreeze cycles
 - Decreases albedo in the near-infrared (NIR) wavelengths
- Positive Feedback Loop



Previous Research

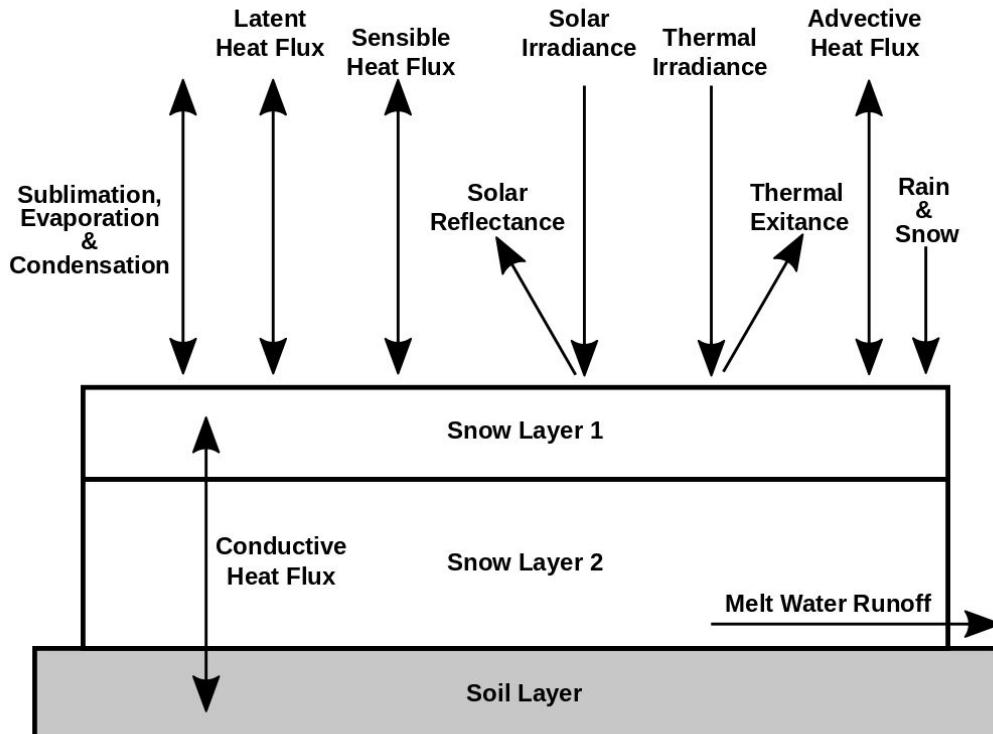
- DRF is the primary driver of snowmelt in CRB
- Not accounting for DRF may be a source of error in snowmelt models
 - Bryant et al. 2013 observed a significant correlation between runoff prediction errors and variability in DRF when evaluating a temperature-index-based model in southwestern Colorado
 - Skiles et al. 2012 noted enhanced snowmelt rates when informing a physically based snowmelt model with in situ observations of dust-influenced snow albedo in Senator Beck Basin
- Previous research relied on one-dimensional snowmelt models which do not fully capture spatial variability across an entire basin
- This study uses in situ albedo observations to inform a spatially distributed and physically based model to explore the effect that DRF has on snowmelt in a dust-influenced basin

DEM



Snowmelt Model

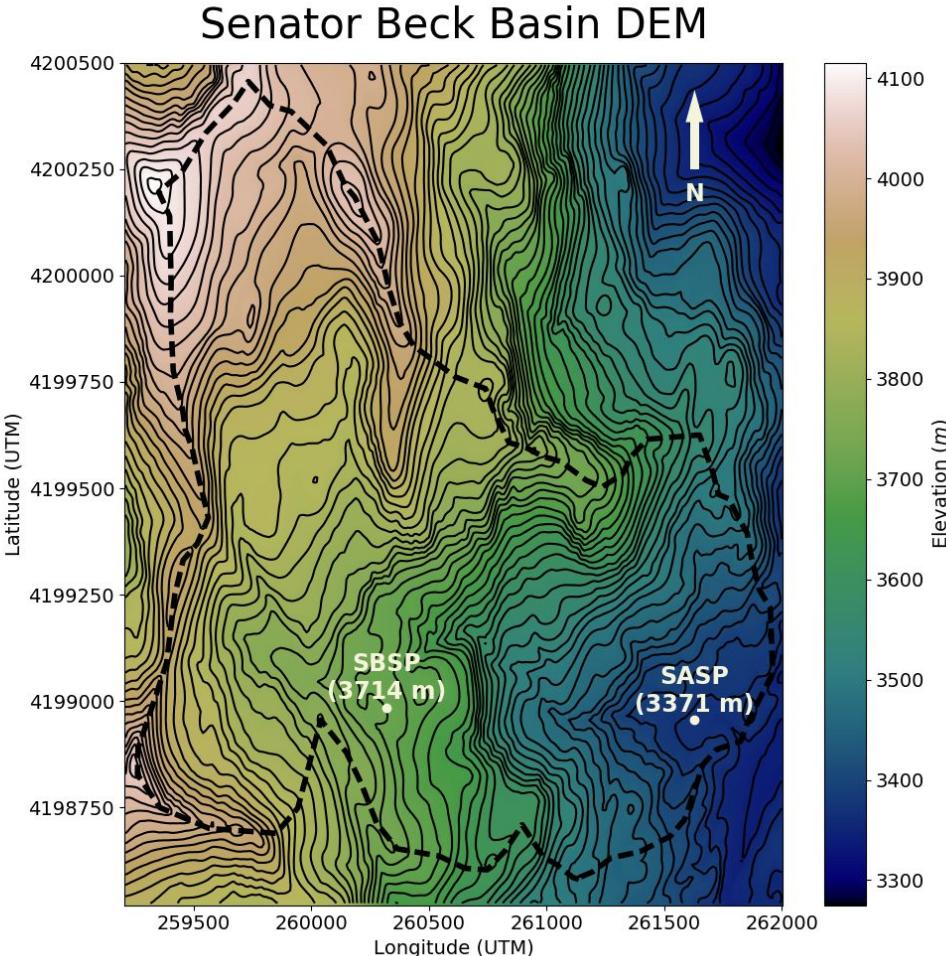
- **iSnowball**
 - Physically based and spatially distributed
 - Two snow layers (Active/Bulk)
 - Forcing inputs drive mass and energy balance of the modeled snowpack
- **Spatial Model Resource Framework (SMRF)**
 - Distributes point forcing data over a digital elevation model (DEM)
 - Requires at minimum time series of:
 1. Precipitation
 2. Air Temperature
 3. Wind Speed/Direction
 4. Incoming Solar Radiation



Based on figure from Marks et al. 1999

Senator Beck Basin

- Senator Beck Basin Study Area (SBB SA)
 - A 3 km² dust-impacted, mid-latitude mountain basin
 - Located in San Juan Mountains of Colorado
- Center for Snow and Avalanche Studies (CSAS)
 - Collected nearly continuous data since 2005
 - 1. Stream Gauge
 - 2. Snow Pits
 - 3. Micrometeorological Towers
- Airborne Snow Observatory (ASO)
 - Made periodic flights over SBB SA since 2013
 - 1. Lidar (Snow Depth)
 - 2. Spectrometer (Albedo)



Study Plots

- **Swamp Angel Study Plot (SASP)**
 - 30 m x 30 m plot
 - Elevation: 3371 m
 - Sits on a flat, treeless subalpine meadow
 - Well sheltered from the wind
- **Senator Beck Study Plot (SBSP)**
 - 12 m x 36 m plot
 - Elevation: 3714 m
 - Sits on alpine bench above the treeline
 - Strongly influenced by wind which prevents collection of precipitation

Images courtesy of McKenzie Skiles



SASP

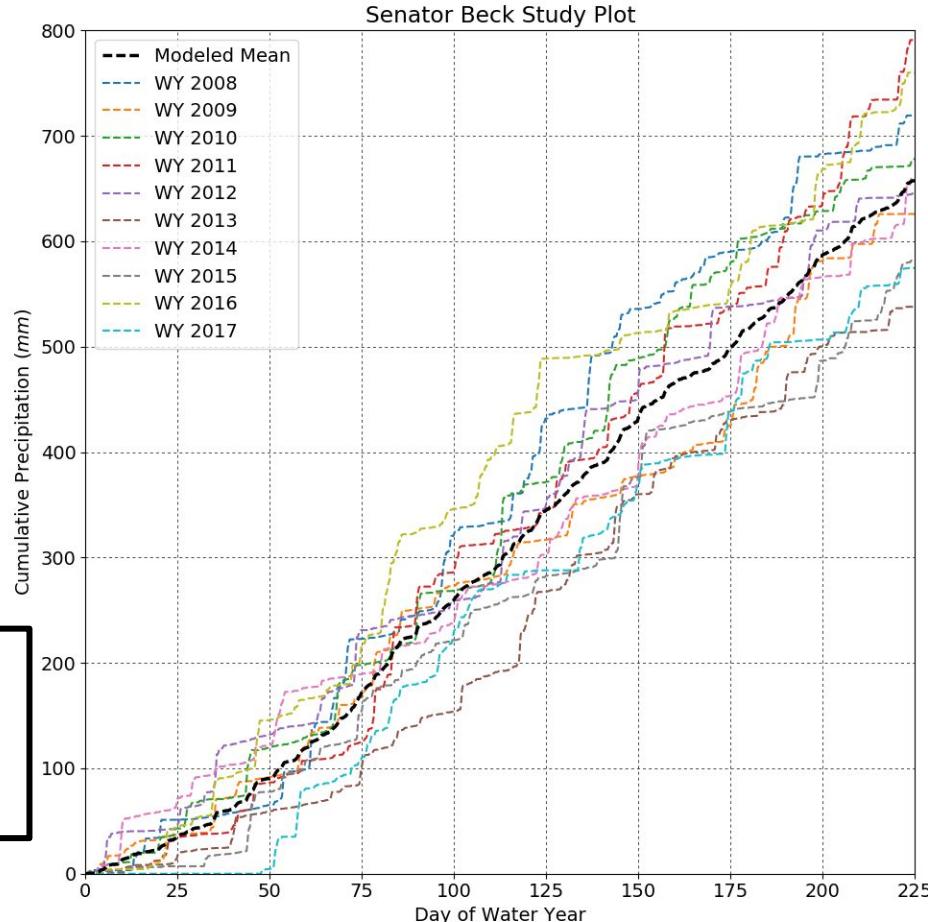
SBSP

Estimating Precipitation at SBSP

- SMRF requires data from at least two different points on a DEM to make a spatial distribution
- Precipitation at SBSP estimated using a simple mass-balance model
 - Estimates the liquid water needed to account for observed increases of fresh snow in depth sensor data
 - Uses air temperature data to estimate percent of liquid water that fell as snow (Susong et al. 1999)
 - Also uses estimates of the density of fresh snow

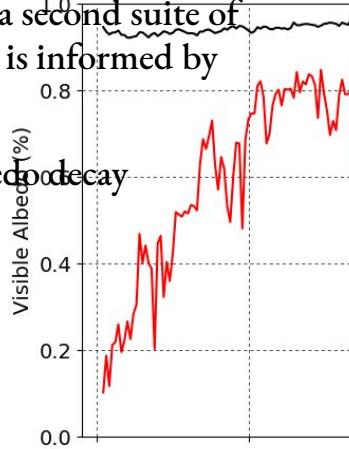
- $\text{percent}_{\text{snow}} = f(\text{T}_{\text{air}})$
- $h_{\text{precip}} = \Delta^+ h_{\text{snow}} \cdot (\rho_{\text{snow}}/\rho_{\text{water}}).$

$\text{percent}_{\text{snow}}$



Updating Albedo

- This study compares iSnobal results from initial model runs of 'clean snow' with a second suite of model runs where the model is informed by in situ albedo

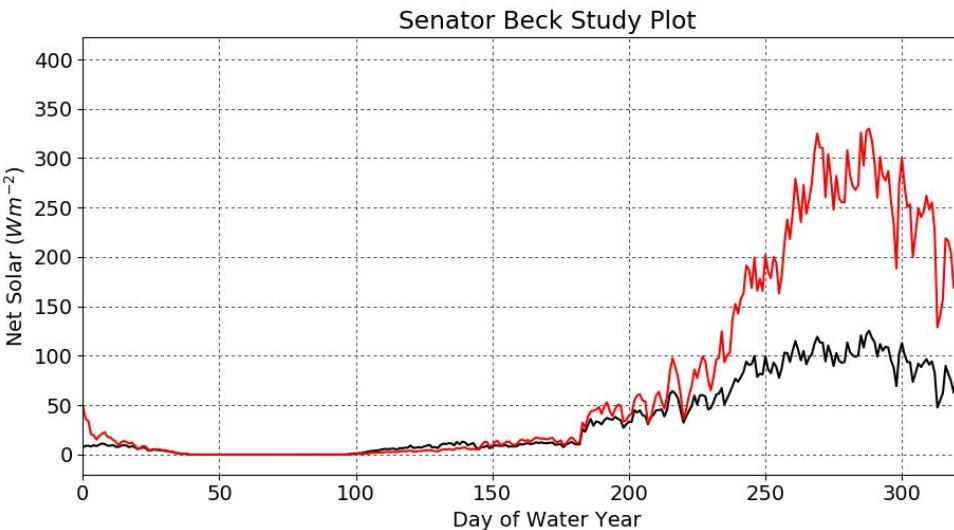
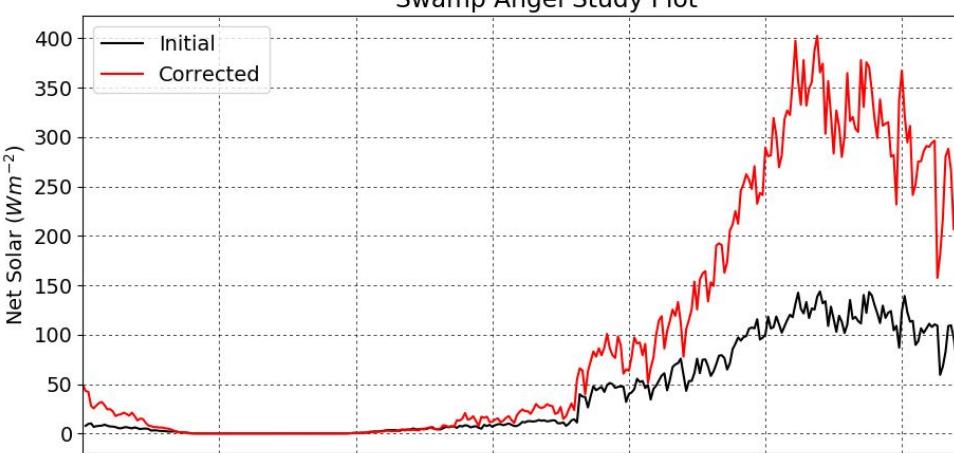


- Initial runs use an age-based albedo decay

- Time since last storm
- Solar zenith angle
- Snow grain size

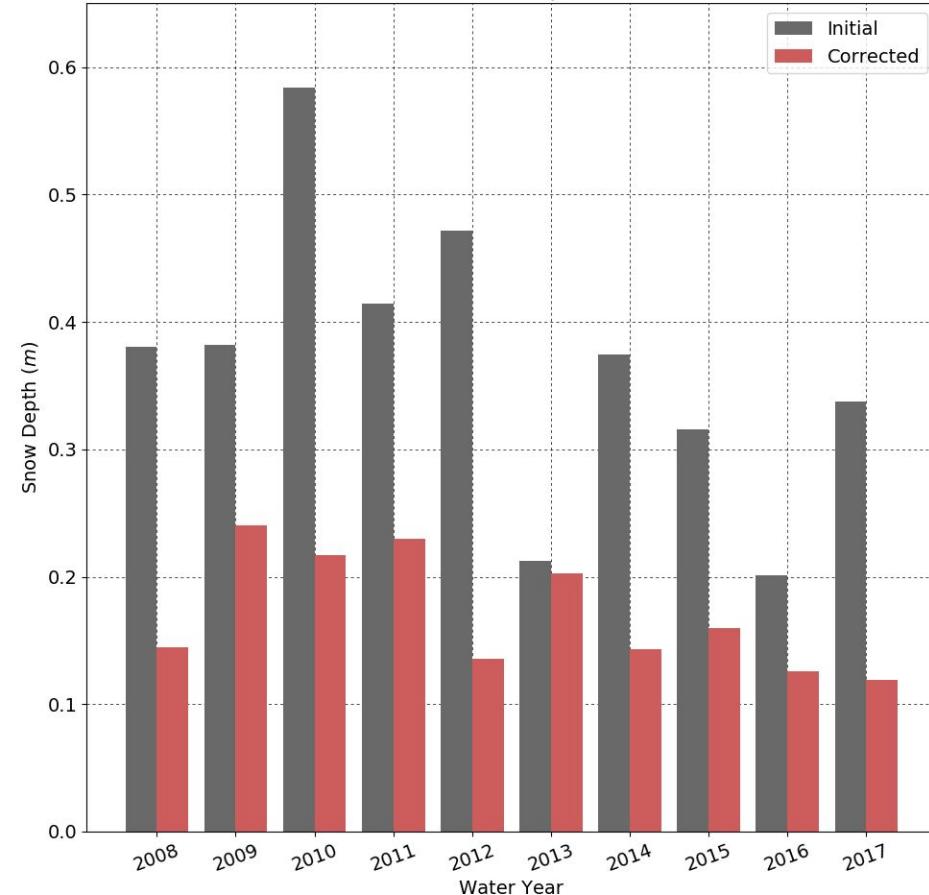
- Updated VIS and NIR albedo

- Scaling factors calculated at pixels containing towers
- Scaling factors are distributed across DEM using detrended kriging
- Distributed scaling factors used to update initial albedo runs

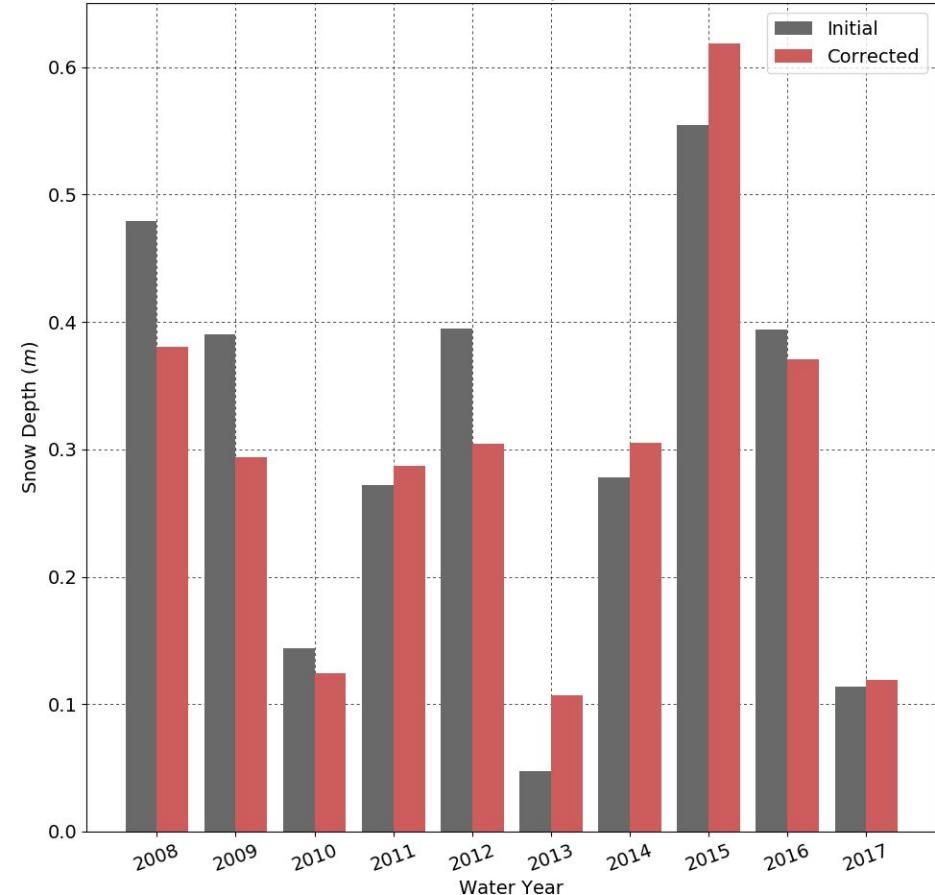


Snow Pit Comparison: RMSE Snow Depth

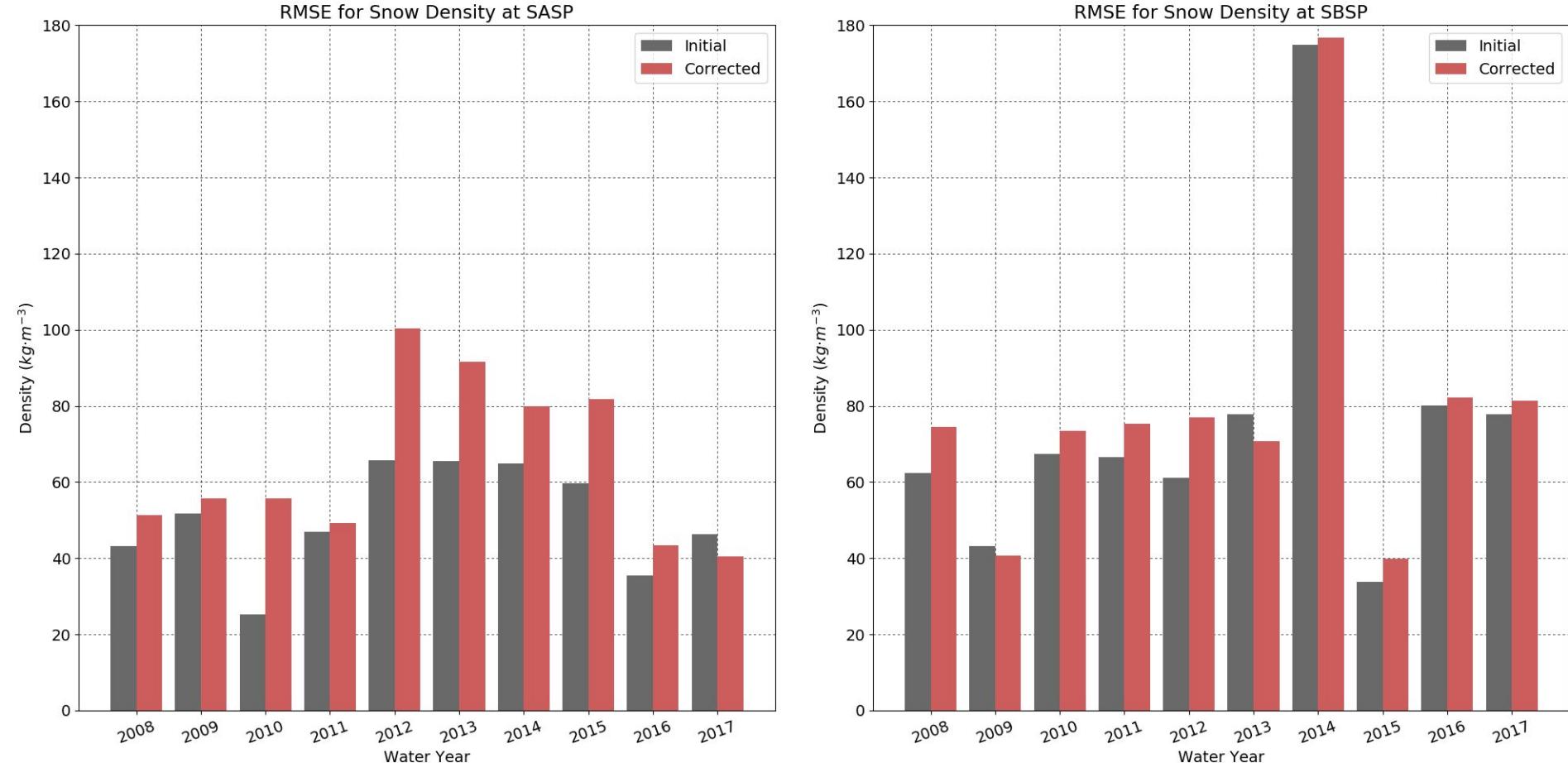
RMSE for Snow Depth at SASP



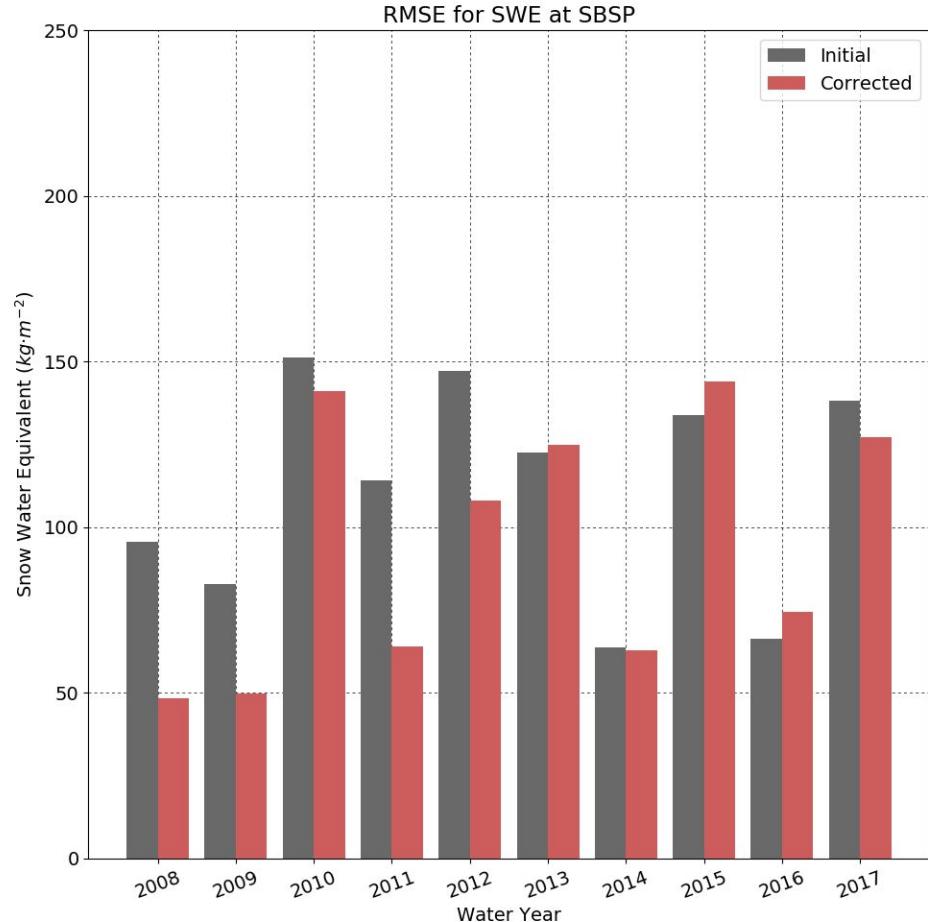
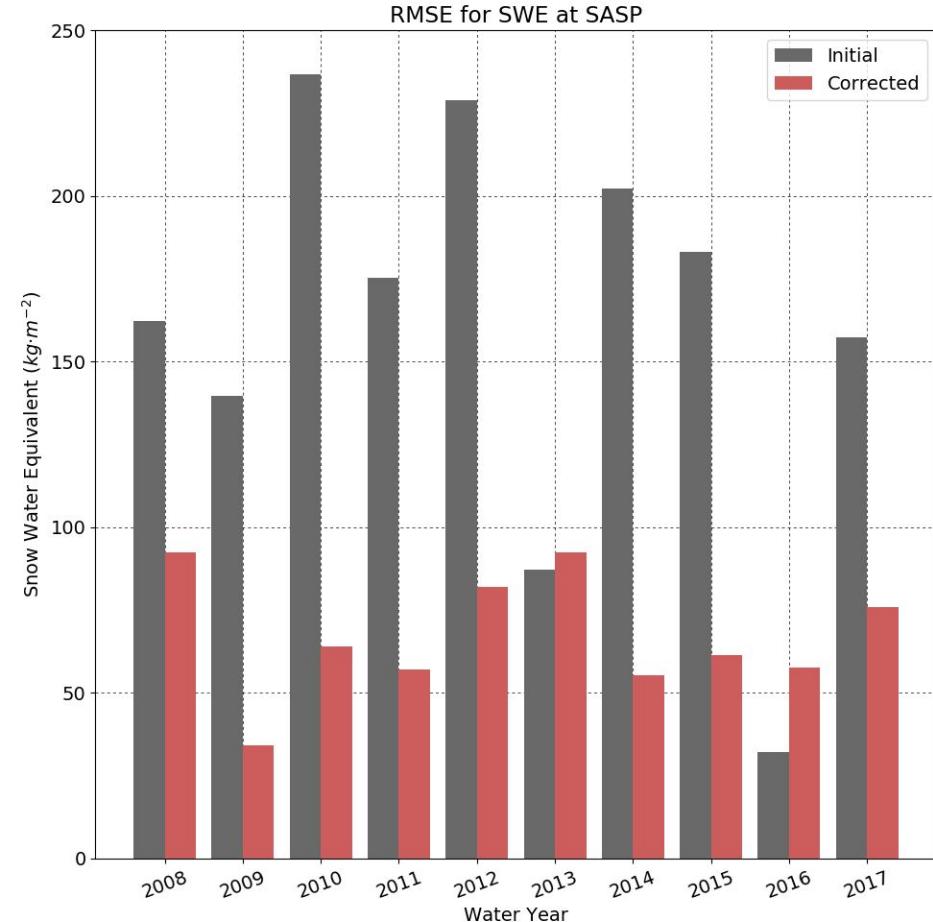
RMSE for Snow Depth at SBSP



Snow Pit Comparison: RMSE Snow Density

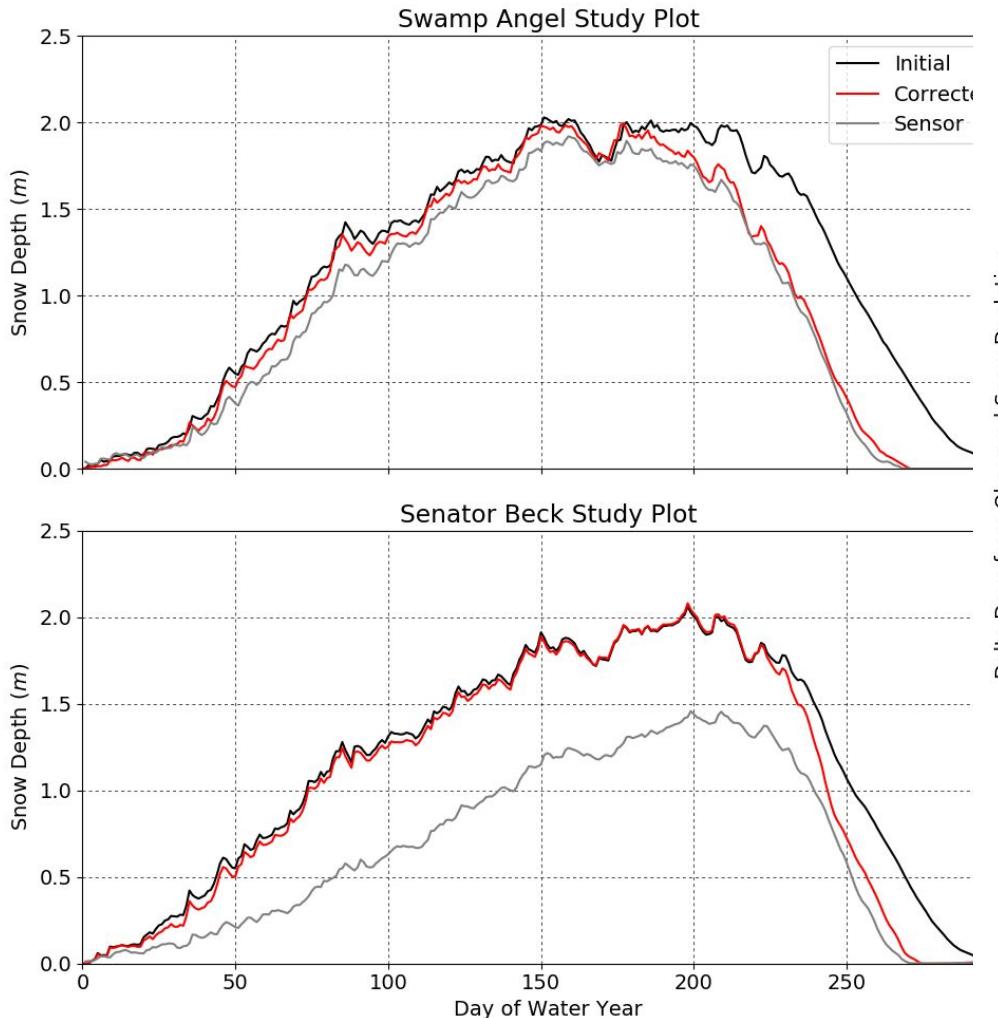


Snow Pit Comparison: RMSE Snow Water Equivalent



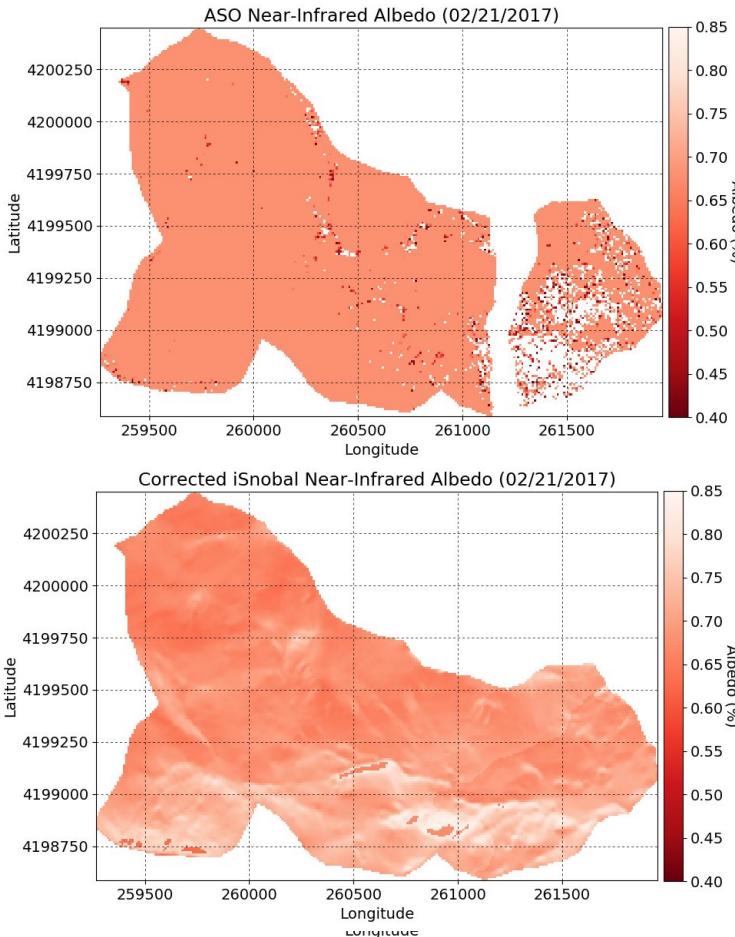
Snowmelt Timing

- Initial iSnobal runs over estimate the day of snow depletion by 37.2 days at SASP and 32.7 days at SBSP
- Updated model runs have accelerated decline in snow depth toward the end of the snow season
- Overestimates of snow depletion are reduced to 4.6 days at SASP and 8.5 days at SBSP
- Errors in estimating SBSP precip complicates analysis of results
- Improvements in snowmelt timing is controlled primarily due by the amount of dust deposited each season
 - Relatively low dust years: 2015 , 2017
 - Relatively high dust years: 2009, 2012, 2013



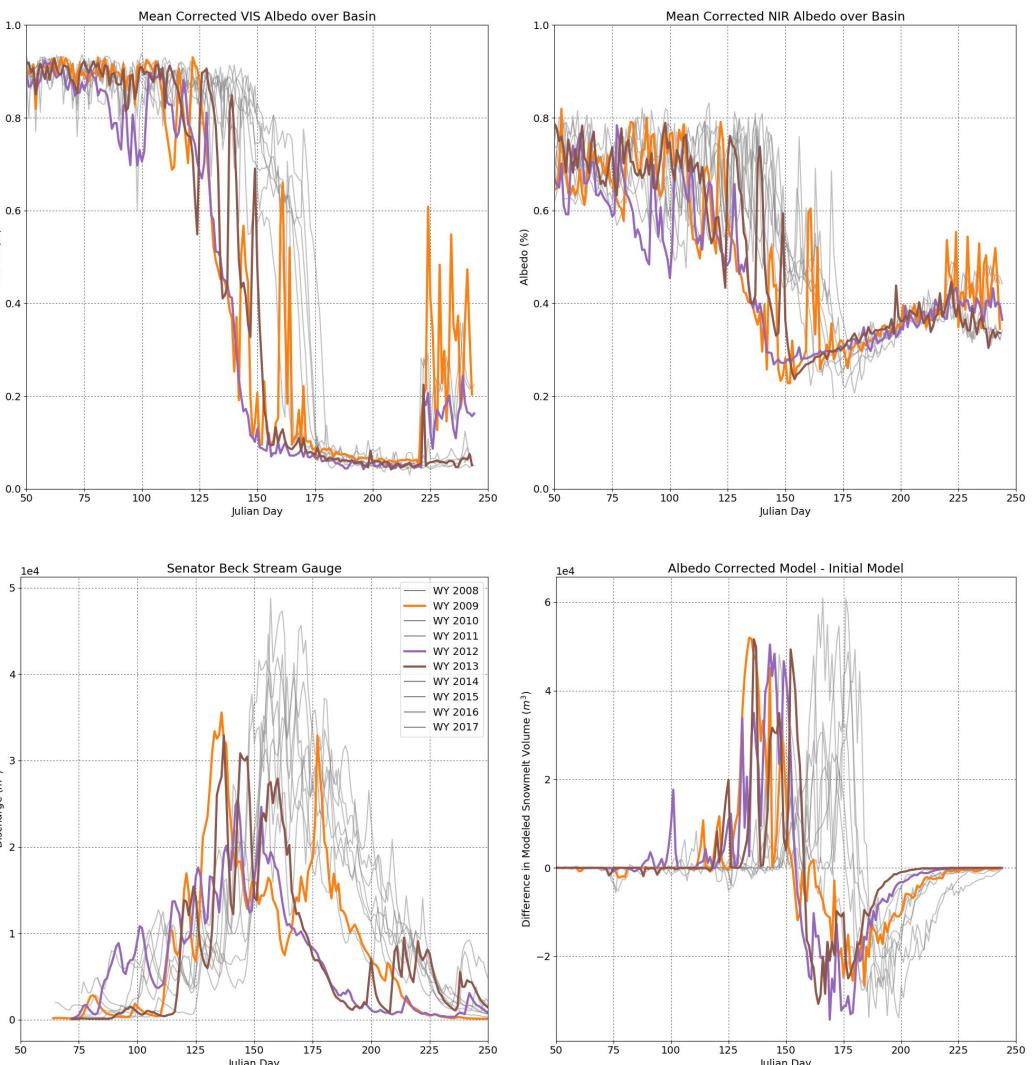
ASO Comparison: February 21, 2017

- Compare iSnobal results with lidar and spectroscopy data from ASO
- Early season snowpack of a low dust year means that initial and updated runs are very similar
- Differences in ASO and modeled snow depth are likely due to:
 - Poorly constrained precipitation lapse rates
 - Not accounting for redistribution by wind
- ASO reveals a relatively fresh/clean snowpack similar to initial and updated modeled albedos
- Method of distributing scaling factors likely a source of error



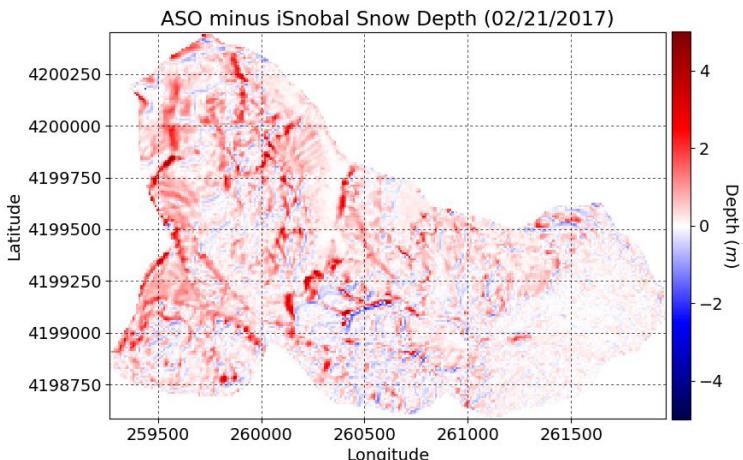
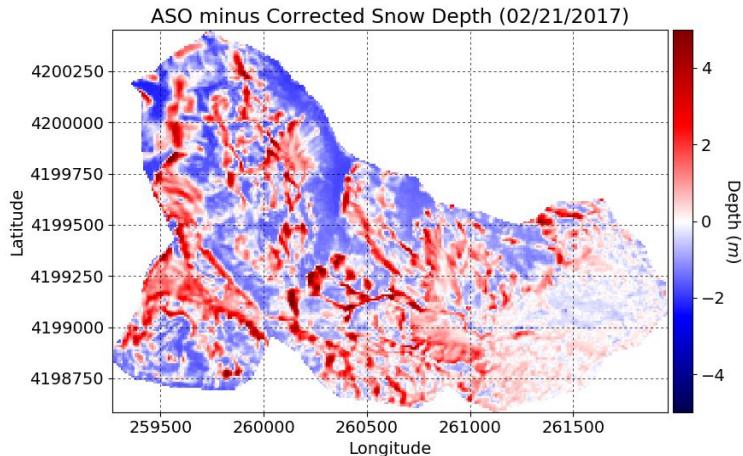
Stream Gauge Comparisor

- Compare iSnobal results with data from Senator Beck Stream Gauge (SBSG)
- Relatively low dust years: 2015 , 2017
 - Display relatively higher VIS and NIR albedo across the basin
 - Stream discharge peaks later in the season
 - Updates model runs display minor shifts in the timing of snowmelt
- Relatively high dust years: 2009, 2012, 2013
 - Display relatively lower VIS and NIR albedo across the basin
 - Stream discharge peaks earlier in the season
 - Updates model runs greatly improve the timing/magnitude of snowmelt



Conclusion and Future Work

- This study uses in situ albedo observations to inform a spatially distributed and physically based model to explore the effect that DRF has on snowmelt in a dust-influenced basin
 - In general, informing iSnobal with in situ albedo observations brought results closer in line with records from snow pits and depth sensors, especially during relatively high dust years
 - Overestimates in the day of snow depletion decreased by 32.6 days at SASP and 24.8 days at SBSP
 - Data from ASO can be used to evaluate modeling choices
 - The timing of snowmelt shifted to more closely match stream gauge measurements
- Future work will focus on improving precipitation lapse rates, comparing models with additional ASO flights, and improving our ability to model complex spatial pattern of snow albedo



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