

# Snow-related Measurements in Operational Streamflow Forecasting at NOAA/CBRFC

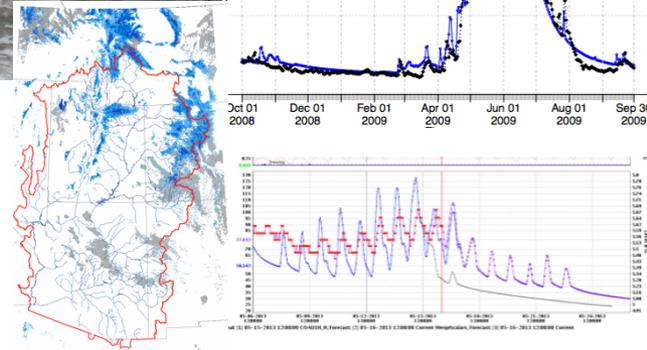
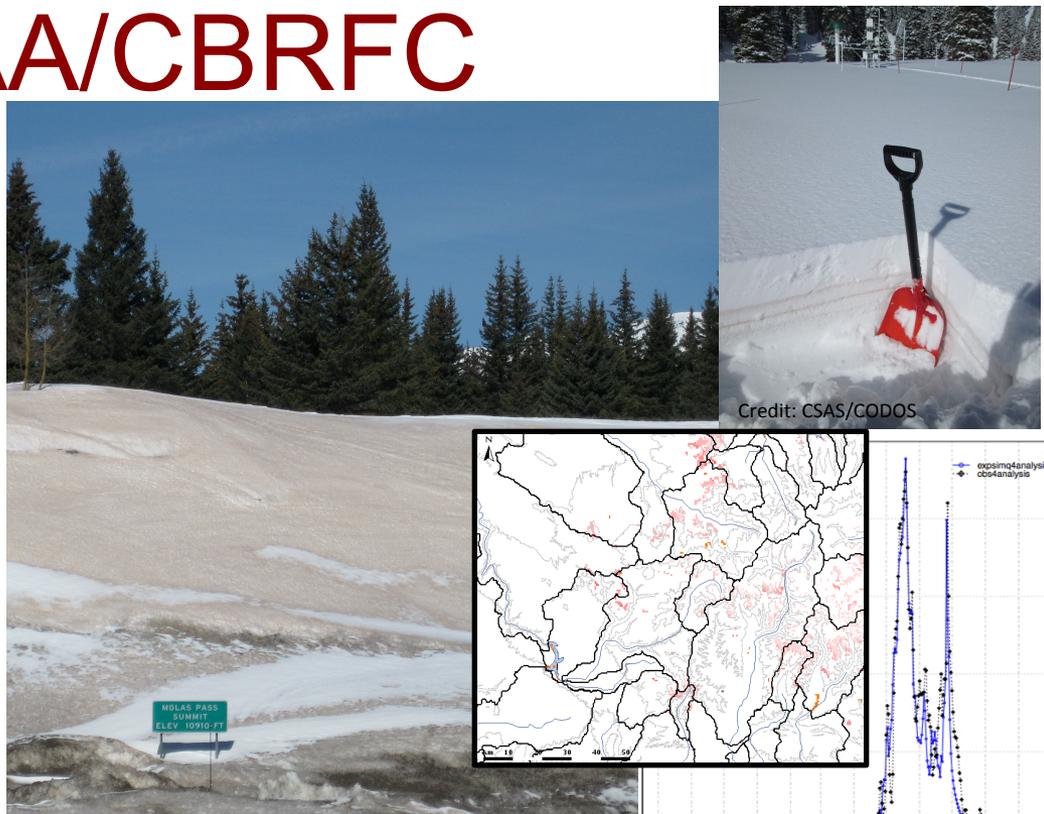
Stacie Bender, Paul Miller,  
Brent Bernard, John Lhotak,  
and Craig Peterson

NOAA/National Weather Service  
Colorado Basin River Forecast Center  
Salt Lake City, UT

Western Water Assessment  
Snowpack Monitoring Workshop

Lander, WY

August 27, 2015





# NWS RFCs



## NOAA/National Weather Service River Forecast Centers (RFCs)

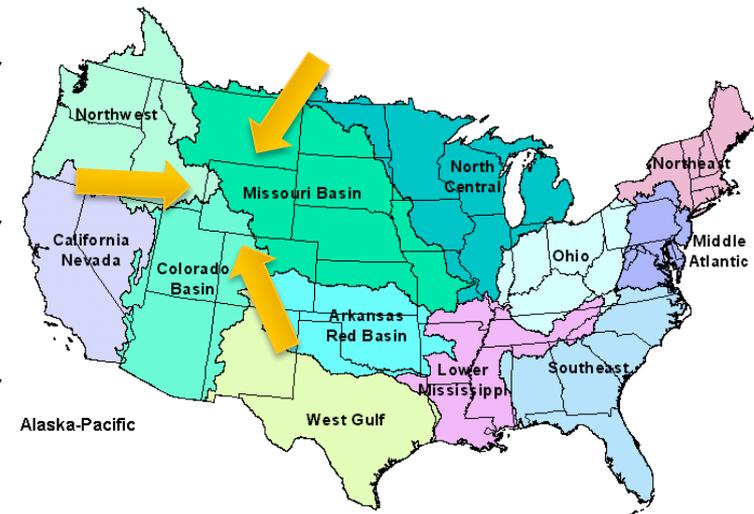
Operational streamflow forecasts across the United States

WY is covered by three RFCs:

- CBRFC (Salt Lake City, UT)
  - 35% of RFC forecast points in WY
- MBRFC (Pleasant Hill, MO)
  - 55% of RFC forecast points in WY
- NWRFC (Portland, OR)
  - 10% of RFC forecast points in WY

Forecast types:

- short-term streamflow, out 5-10 days
- seasonal runoff volume
- seasonal peak streamflow (NW and CB only)



National Weather Service River Forecast Centers

[www.cbrfc.noaa.gov](http://www.cbrfc.noaa.gov)  
[www.weather.gov/mbrfc/](http://www.weather.gov/mbrfc/)  
[www.nwrfc.noaa.gov/rfc/](http://www.nwrfc.noaa.gov/rfc/)

RFCs

Importance of Snow Info

Operational CBRFC Modeling

CBRFC Uses of Surface Observations

CBRFC Uses of Remote Sensing

What's Next?

Questions & Comments

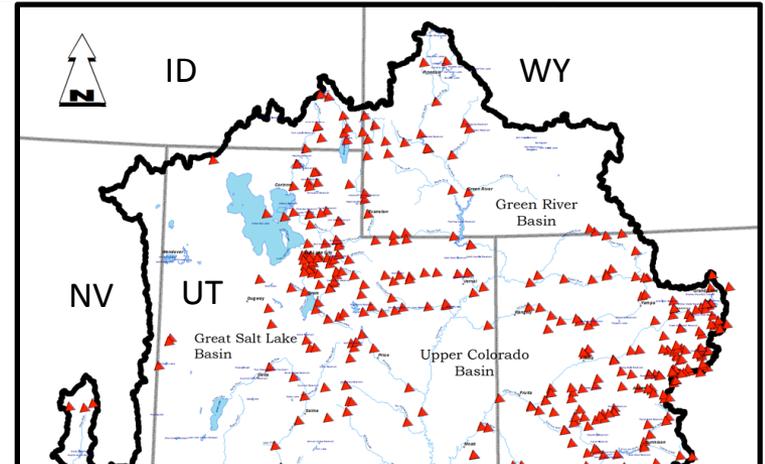
## Colorado Basin River Forecast Center (CBRFC)

### Hydrologic regimes:

- snow-dominated to flash flood hydrology
- natural to regulated

500+ streamflow forecast points across 7 states

~1150 modeling units (snow and soil moisture model run on each)



### Stakeholders dependent upon snowmelt-driven streamflow forecasts:

- NWS Weather Forecast Offices
- US Bureau of Reclamation
- water conservation districts
- municipalities
- recreational community
- others

RFCs

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# Importance of Snow Info

RFCs

*Importance of Snow Info*

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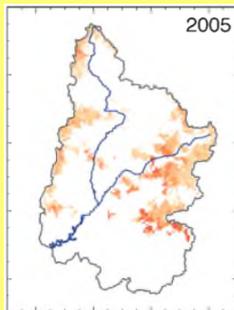
**Snow (especially water equivalent) = primary predictor of seasonal runoff volume**



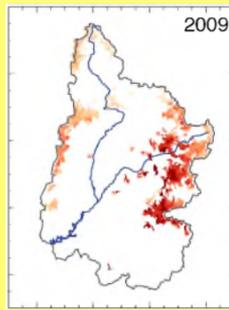
**Recent years' snowpack - extremes in both directions**

- mostly dry (☹️)
- sometimes, wet (generally 😊)
- variability in "dust on snow"

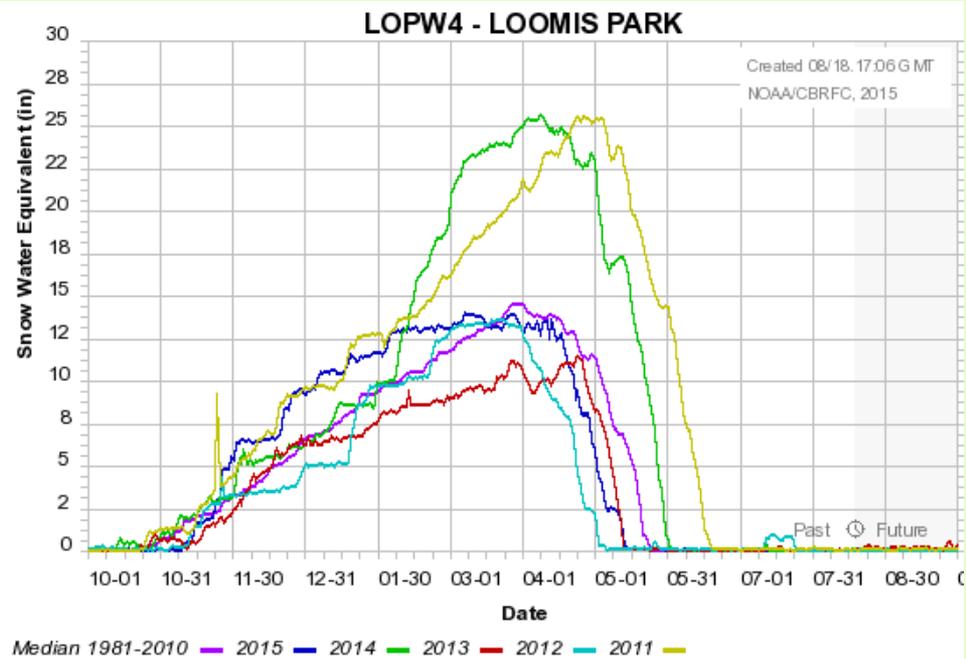
"Dust on snow" images for 2005 (light dust) and 2009 (heavy dust)



Map credit: Bryant-Burgess, 2014



Map credit: Bryant-Burgess, 2014



**Precip type = primarily snow**

- 60-80% of precipitation shows up as SWE

SNOTEL site	Precip through April 30, on average (inches)	May 1 SWE, on average (inches)	SWE/precip (%)
Loomis Park (NWS id: LOPW4)	18.8	11.3	60%
Gros Ventre Summit (NWS id: GRVW4)	14.5	12.3	85%



# Importance of Snow Info

Additional datasets and information about snowpack conditions assist CBRFC hydrologists with more informed forecasting decisions.

Expanding CBRFC's use of snow-related measurements is key.

Past (through 2009):

Surface-based networks (SNOTEL) only, SNOTEL sites w/ < 30 year period of record

Past (through 2010-2012):

Surface-based networks (SNOTEL) only, \*\* most SNOTEL now w/ 30 yr period of record \*\*

Present and into the future (2013 to present):

Surface-based networks (SNOTEL, CSAS field obs)

+

Remote sensing (MODIS, VIIRS, ASO)

=

More complete set of snowpack observations

**Note:** Remote sensing datasets are *NOT* intended to replace surface-based observations in CBRFC modeling and forecasting but rather to complement surface-based observations.

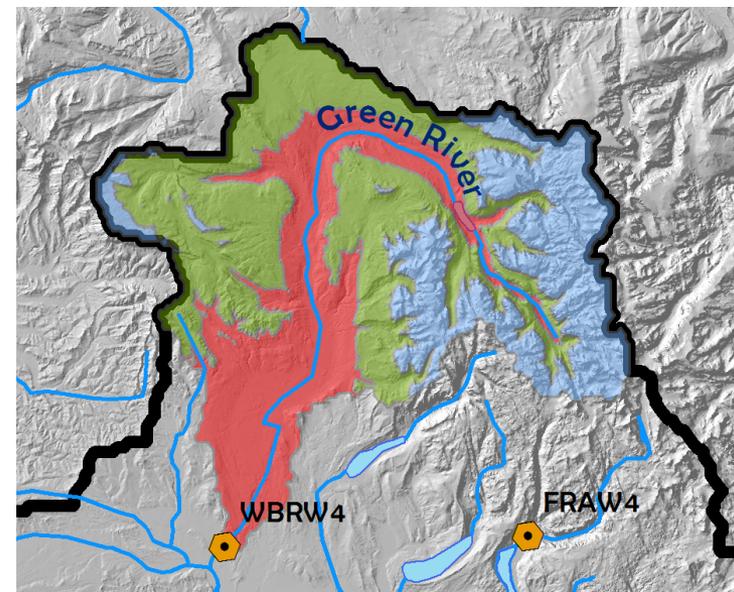
- RFCs
- Importance of Snow Info**
- Operational CBRFC Modeling
- CBRFC Uses of Surface Observations
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# Operational CBRFC Modeling

- each watershed is sliced & diced into multiple areas
- modeling units = elevation bands or zones
- snow and soil moisture models are run daily for each “zone”

EXAMPLE: Green River headwaters in WY (NWS ID = WBRW4)

Elevation Zone	Mean Elevation (ft)
<b>WBRW4HUF (Upper)</b>	11054
<b>WBRW4HMF (Middle)</b>	9140
<b>WBRW4HLF (Lower)</b>	8005



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# Surface Measurements

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## NRCS's SNOTEL network = primary source of surface-based snowpack information for CBRFC

- 1<sup>st</sup>-of-month SWE data - statistical modeling for runoff volume forecasts
- SNOTEL precipitation data :
  - Real-time hourly – initially build the simulated snowpack in SNOW17
  - QC'd monthly values – “update” the snowpack simulated by SNOW17

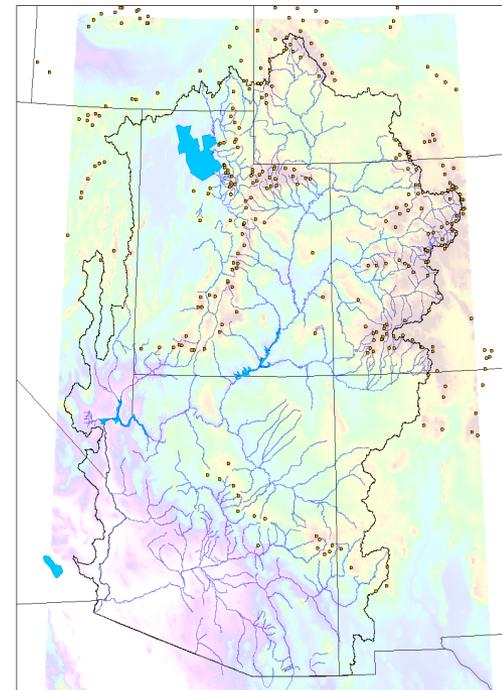
## Additional surface based info: field observations from the Center for Snow and Avalanche Studies/Colorado Dust-on-Snow Program

More details on next few slides!



**Photo (right):** Clean snow over a dust layer, April 2014.

Courtesy Center for Snow and Avalanche Studies, Colorado Dust-on-Snow Program, Silverton, CO



**Map:** NRCS SNOTEL network for CBRFC AOR



# Surface Measurements: SNOTEL SWE



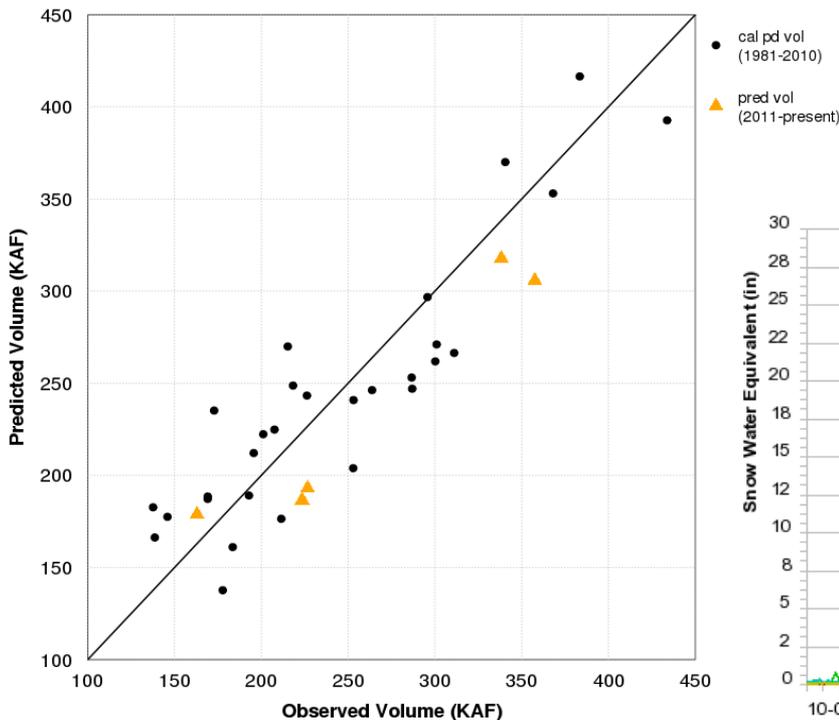
**SNOTEL SWE:** used on the 1<sup>st</sup> of the month for water supply forecasting

Quantitative use:  
as a predictor in statistical regression models



Predicted AMJJ Q Volumes vs. Observations for  
GREEN - DANIEL- NR- WARREN BRIDGE- AT (WBRW4)

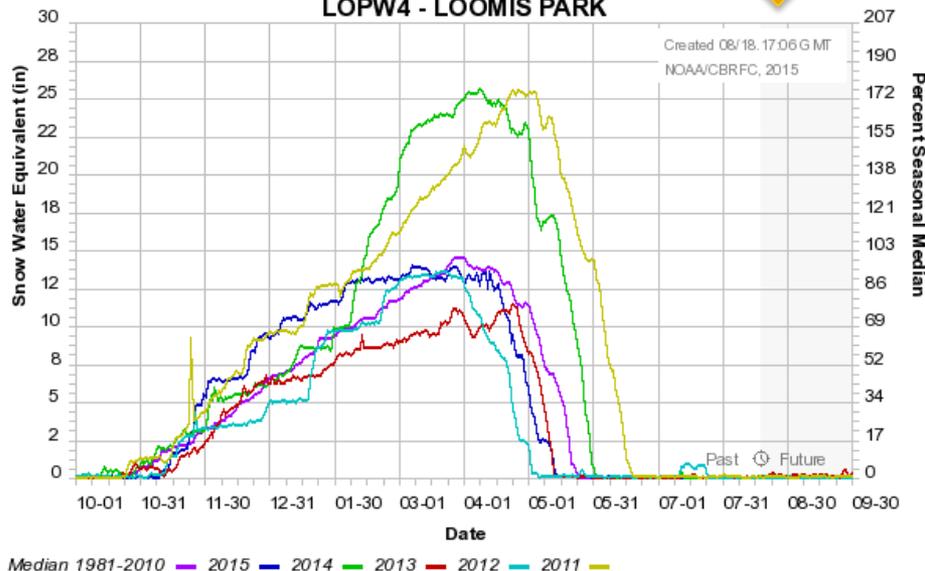
Iss MMDD=0401, Eq=P  
 $y = 8.13 + 2.51*(\text{Apr } 1 \text{ KNDW4 SW}) + 0.09*(\text{Apr } 1 \text{ LOPW4 SW}) + 14.37*(\text{Apr } 1 \text{ GRVW4 SW}) + 1.51*(\text{Apr } 1 \text{ NFLW4 SW})$



Qualitative use:  
forecaster awareness of general snowpack conditions (above/below average, median, determine analog years, etc.)



Colorado Basin River Forecast Center  
LOPW4 - LOOMIS PARK



RFCs

Importance of  
Snow Info

Operational  
CBRFC  
Modeling

**CBRFC Uses of  
Surface  
Observations**

CBRFC Uses of  
Remote  
Sensing

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Comments



# Surface Measurements: SNOTEL Precip



## SNOTEL Precipitation Uses:

- real-time precipitation - build the SNOW17-simulated snowpack in the deterministic CBRFC hydro model (run daily)
  - Note: SNOW17 builds snowpack w/ precip data, *not SWE data*
- monthly precipitation – “update” the SNOW17-simulated snowpack
- seasonal accumulated precipitation – statistical models for water supply forecasting

RFCs

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CBRFC  
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***CBRFC Uses of  
Surface  
Observations***

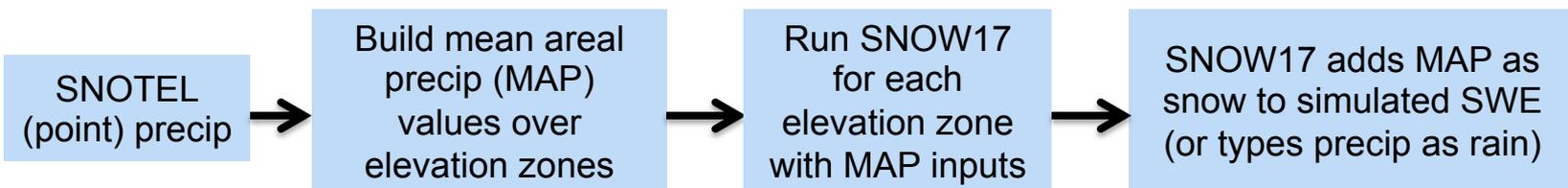
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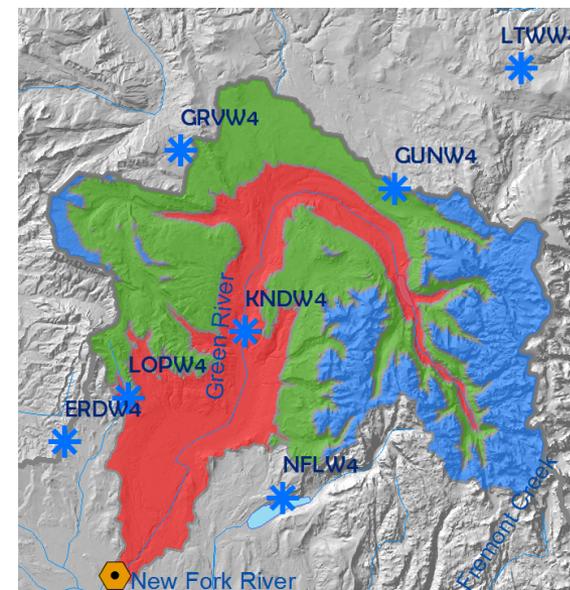
Questions &  
Comments

# Surface Measurements: SNOTEL Precip

## Building the simulated snowpack with real-time SNOTEL precipitation



Elevation Zone	SNOTEL Stations Used to Compute MAP Value
<b>WBRW4HUF (Upper)</b>	LTWW4 (Little Warm) LOPW4 (Loomis Park)
<b>WBRW4HMF (Middle)</b>	LTWW4 (Little Warm) LOPW4 (Loomis Park)
<b>WBRW4HLF (Lower)</b>	KNDW4 (Kendall R.S.) LOPW4 (Loomis Park) GRVW4 (Gros Ventre Summit)



RFCs

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Operational CBRFC Modeling

**CBRFC Uses of Surface Observations**

CBRFC Uses of Remote Sensing

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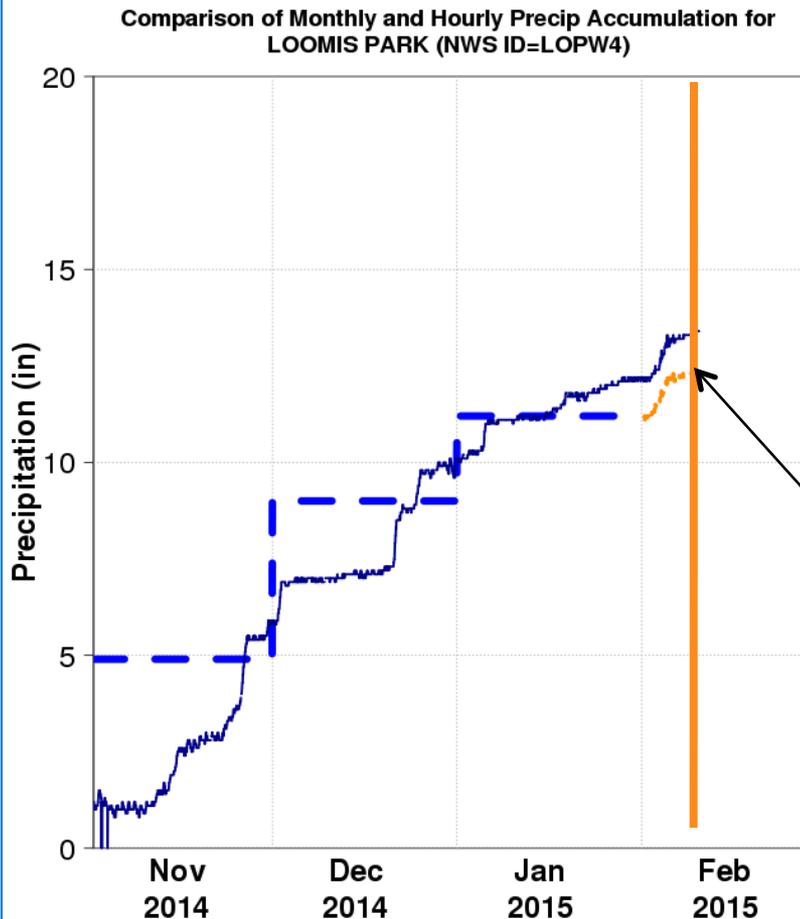


# Surface Measurements: SNOTEL Precip



## Building and updating the SNOW17-simulated snowpack

**Daily model** runs use **real-time**, hourly data – jumpy, can add uncertainty to sim. snowpack



So, when QC'd monthly precip obs become available, use those to **“update”** model SWE.

Example Update Date = Feb 10

accumulated full month MAPs (derived from QC'd **monthly** SNOTEL precip)

+ accumulated MAPs for any partial months (derived from **real time** SNOTEL precip)

= “updated” precipitation accumulation (using Feb 10 as an example)

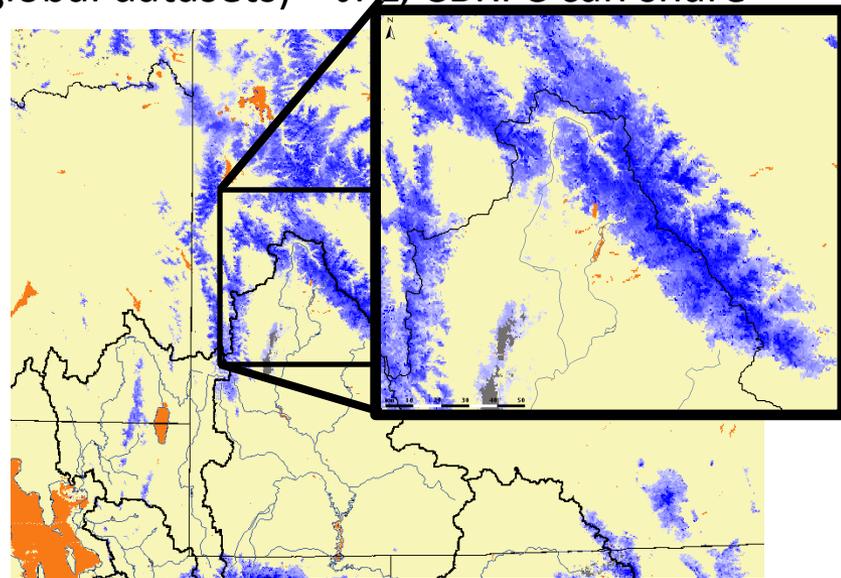
Model is then run forward in time with the new, “updated” estimate of SWE accumulation.

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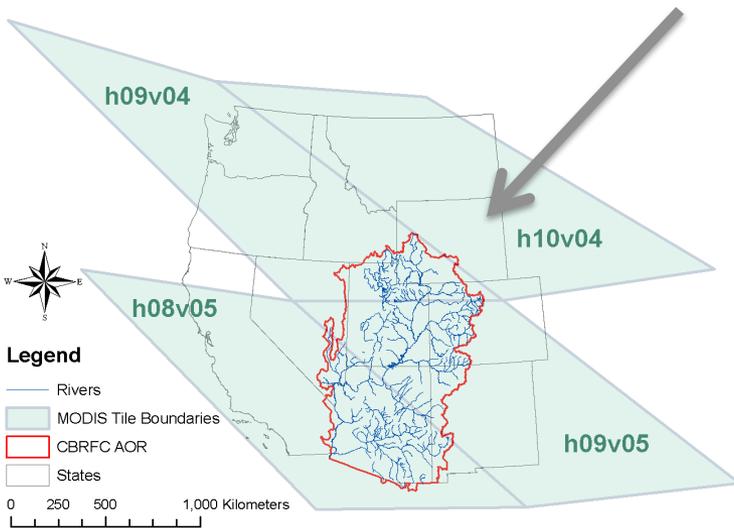
## Remotely-sensed snow data used by CBRFC:

Snowpack Characteristic	Instrument	Algorithm	CBRFC Use
fractional snow-covered area (fSCA)	MODIS	MODSCAG (provided by NASA/JPL)	adjust SNOW17 model SWE as snowpack dwindles
dust-on-snow	MODIS	MODDRFS (provided by NASA/JPL)	used to adjust melt rates in SNOW17

- Data are available across all of WY (global datasets) – JPL, CBRFC can share
- Period of record = 2000 to present



MODSCAG fSCA April 29, 2015



**Legend**  
 — Rivers  
 MODIS Tile Boundaries  
 CBRFC AOR  
 States  
 0 250 500 1,000 Kilometers

RFCs

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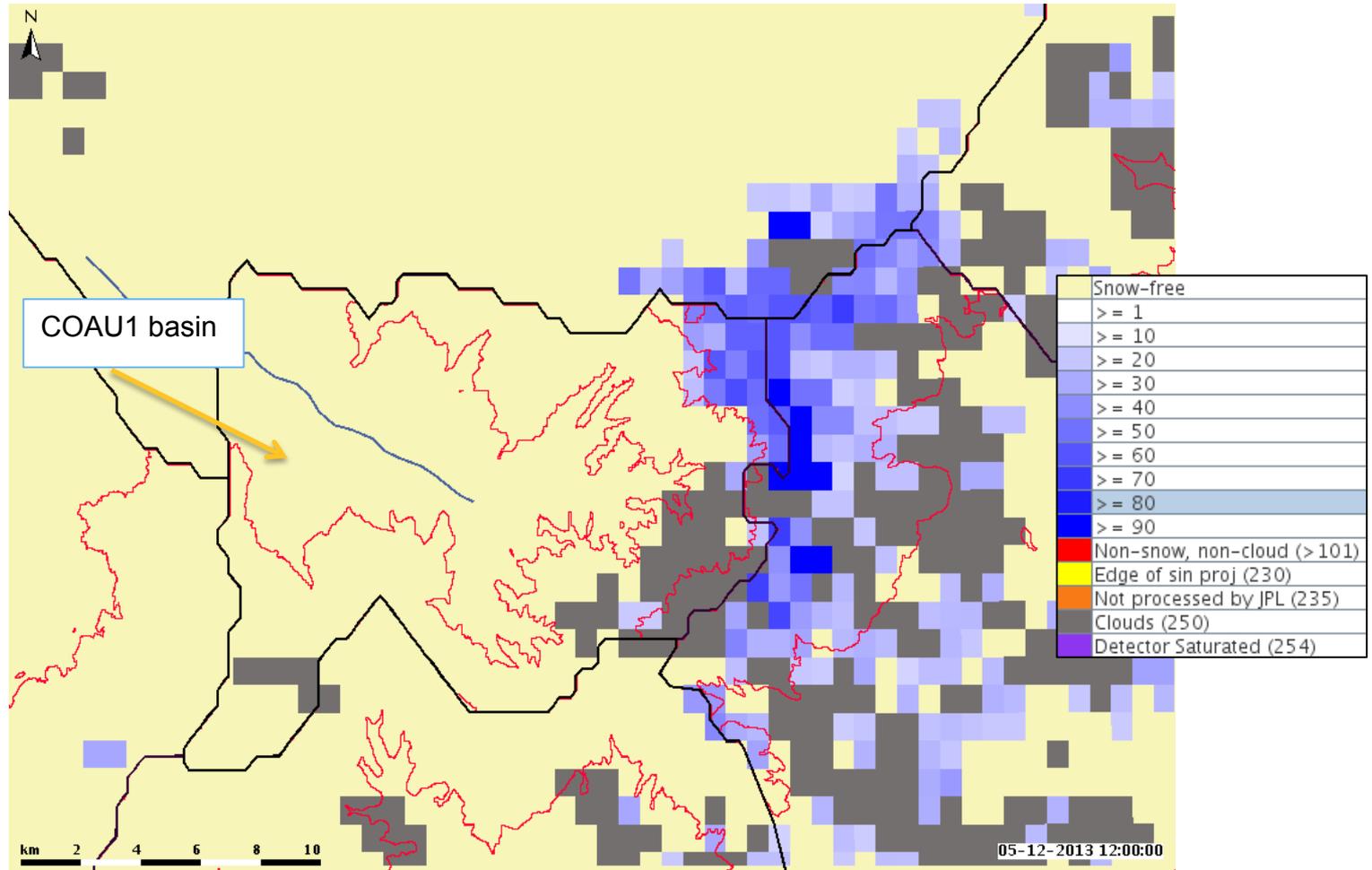
**CBRFC Uses of Remote Sensing**

What's Next?

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# MODSCAG fSCA Example

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MODSCAG fSCA (percent) over southwestern Utah (Coal Creek near Cedar City, NWSID = COAU1), May 12, 2013, as viewed by CBRFC forecasters. The COAU1 basin is outlined in black, with the division between CBRFC elevation zones in red.

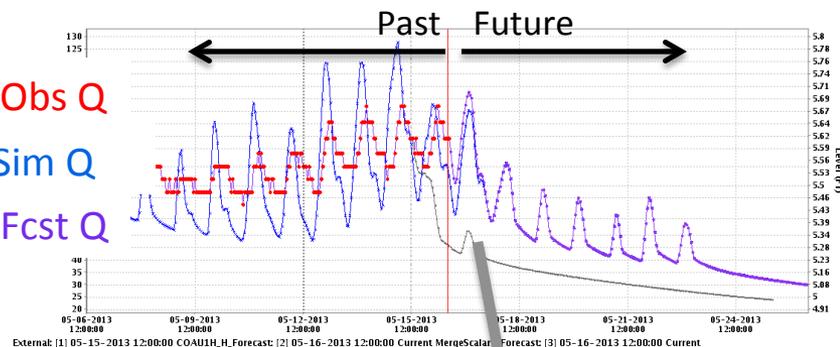
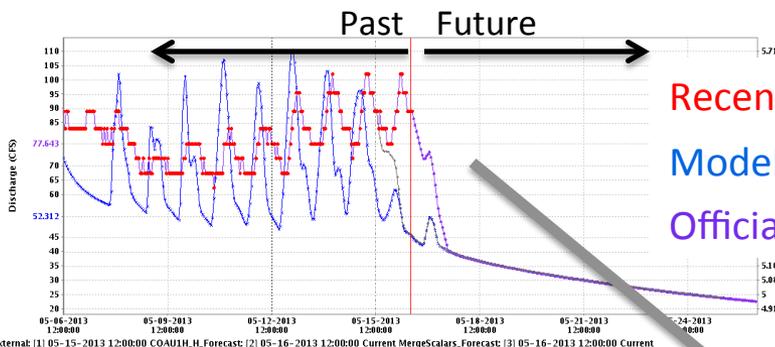
# May 16, 2013 CBRFC forecast modifications informed by MODSCAG fSCA

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Coal Creek, near Cedar City, UT, NWS ID: COAU1/USGS ID: 10242000

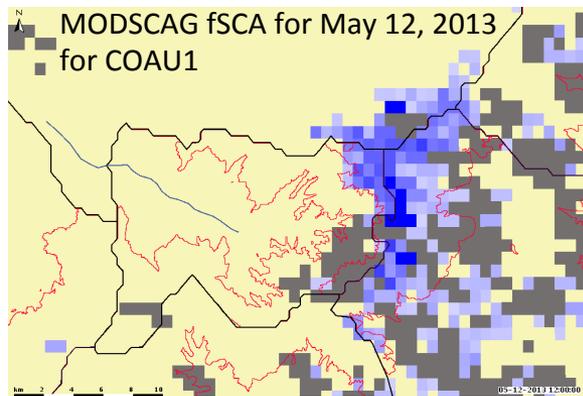
**Before** small SWE adjustment:

**After** small SWE addition:

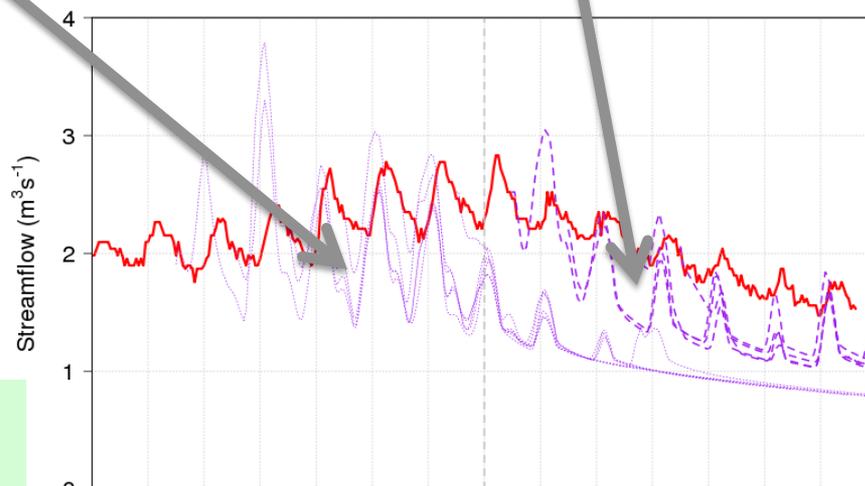


External: [1] 05-15-2013 12:00:00 COAU1H\_H\_Forecast; [2] 05-16-2013 12:00:00 Current MergeScalars\_Forecast; [3] 05-16-2013 12:00:00 Current

External: [1] 05-15-2013 12:00:00 COAU1H\_H\_Forecast; [2] 05-16-2013 12:00:00 Current MergeScalars\_Forecast; [3] 05-16-2013 12:00:00 Current



Currently, MODSCAG fSCA is most useful at end of melt as pseudo-binary indicator of snow presence. Probably need more advanced snow model to fully quantitatively use MODSCAG fSCA at CBRFC (snow model research projects are in progress).



- Observed Q
- ..... Q Fcsts issued prior to adjustment
- - - Q Fcsts issued after adjustment



# 2014 Dust-on-snow Example



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## Current operational CBRFC forecasting system:

- allows (and usually requires) manual adjustment to model simulation by CBRFC hydrologists

**To address snowmelt potentially accelerated by dust-on-snow, consider and combine information from:**

1. Historical analysis
2. Field observations
3. Remote sensing
4. CBRFC forecaster experience and knowledge of future weather possibilities

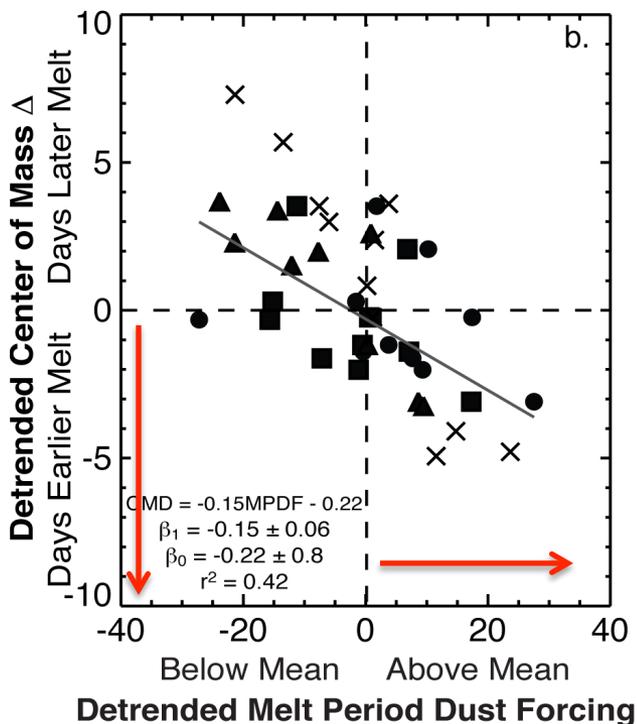
Better informed forecaster  
→ improved Q forecasts

- RFCs
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## Historical Remote Sensing Data:

Dustier than average snowpack  
 → *earlier* snowmelt than what SNOW17 predicts

Very dusty years → typically larger streamflow prediction errors (timing)



REFERENCE:

Bryant, A. C., T. H. Painter, J. S. Deems, and S. M. Bender (2013), Impact of dust radiative forcing in snow on accuracy of operational runoff prediction in the Upper Colorado River Basin, *Geophys. Res. Lett.*, 40, 3945–3949, doi:10.1002/grl.50773.

## Real-time Field Observations:

Provide information about

- Whether or not dust layers exist within the snowpack
- How close the dust layers are to the sfc
- Whether or not the dust layers have emerged

**Photo (right):** Several inches of clean snow above D4 dust layer, as of the morning of April 4. Courtesy Center for Snow and Avalanche Studies, Colorado Dust-on-Snow Program, Silverton, CO (<http://www.codos.org/sbb-4-04-14>)



RFCs

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CBRFC Uses of Surface Observations

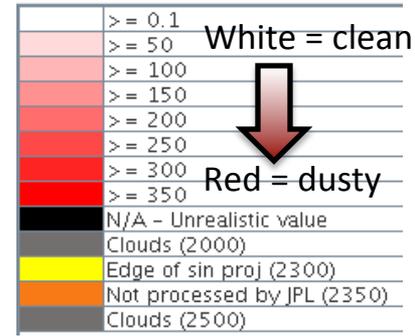
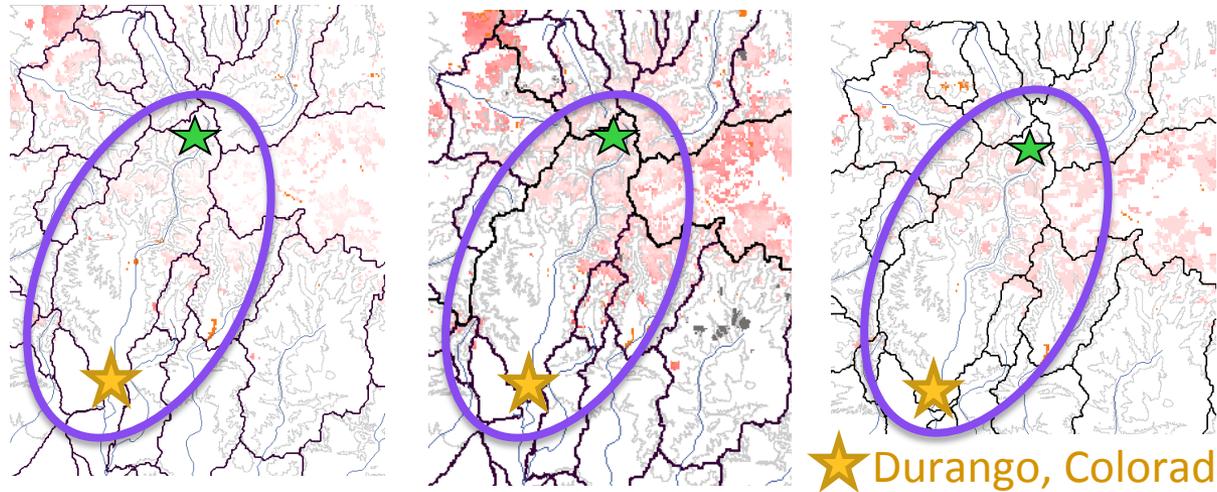
**CBRFC Uses of Remote Sensing**

What's Next?

Questions & Comments

Consistency between new-to-CBRFC datasets and information  
 → confidence in both datasets

**MODDRFS**  
**Dust Radiative Forcing**  
 ( $W m^{-2}$ )



★ Durango, Colorado

April 8, 2014

April 10, 2014

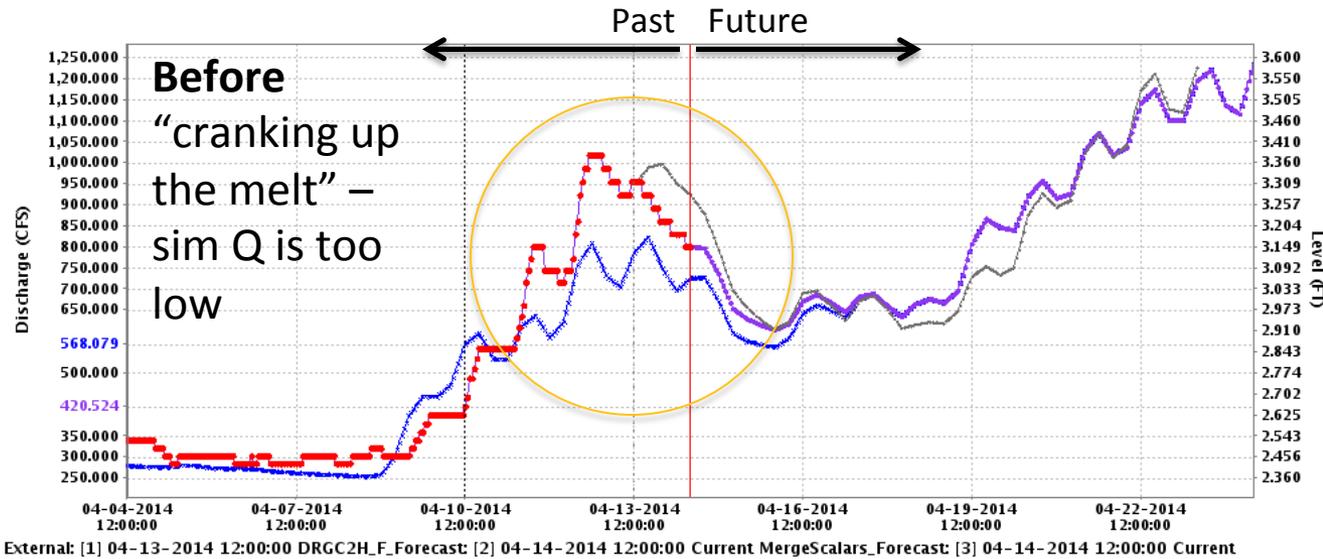
April 11, 2014



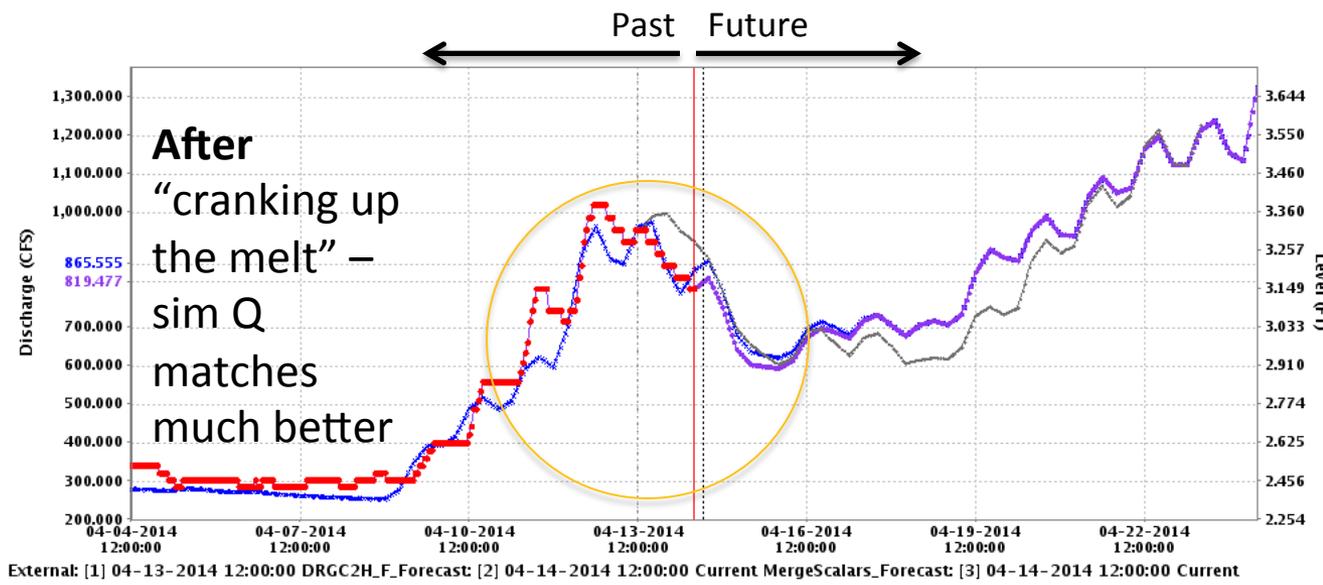
**Photos:** D4 emerging in the upper Animas watershed proper (along Hwy 550 south of Red Mountain Pass). Courtesy Center for Snow and Avalanche Studies, Colorado Dust-on-Snow Program, Silverton, CO

# Manual Adjustments by Forecasters

- RFCs
- Importance of Snow Info
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- CBRFC Uses of Surface Observations
- CBRFC Uses of Remote Sensing*
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Recent Obs Q  
 Model Sim Q  
 Official Fcst Q



Recent Obs Q  
 Model Sim Q  
 Official Fcst Q

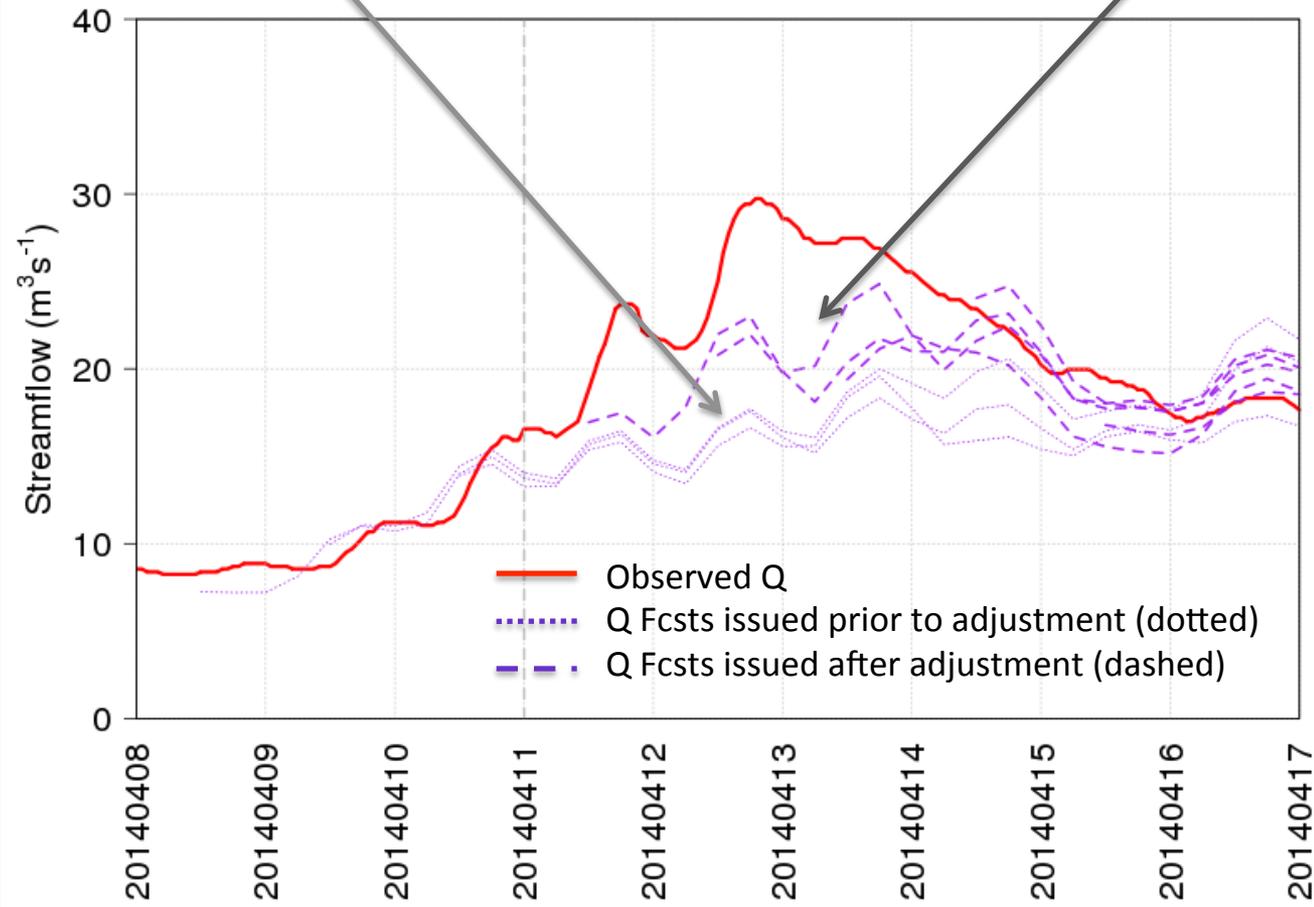
Credit: plots courtesy B. Bernard (CBRFC)

# How did we do in this April 2014 case?

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**Before** informed manual adjustment (dotted): fcsts too low

**After** informed manual adjustment (dashed): fcsts closer to observed streamflow



**Perfect? No.**

**Though, still an improvement!**



# Improving the Adjustment Process



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## MODDRFS-informed manual adjustments to snowmelt rate by CBRFC forecasters are:

1. helpful (see previous example)
2. but subjective and time-consuming

- Need a more efficient, objective method of incorporating MODDRFS “dust-on-snow” data into CBRFC forecasting
- MODDRFS → use it to tweak temperatures that are input to snow model (SNOW17, which is a temperature-index snow model)

# DRFS-informed MAT Adjustments

## Where to start experiments w/ DRFS-informed SNOW17 MAT-adjustment method?

RFCs

Importance of Snow Info

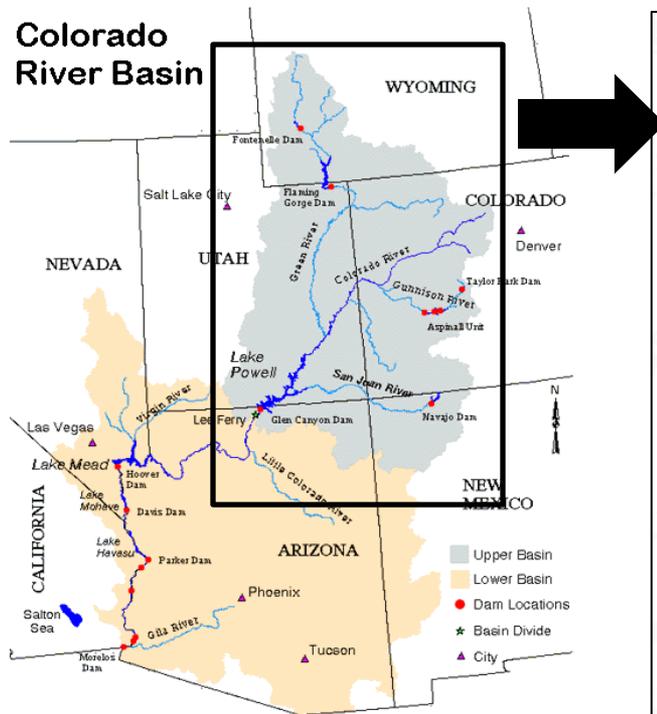
Operational CBRFC Modeling

CBRFC Uses of Surface Observations

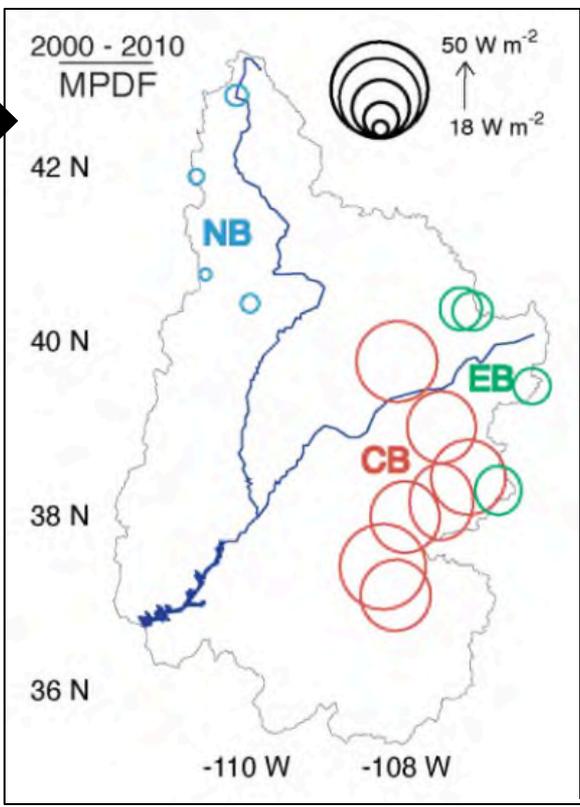
**CBRFC Uses of Remote Sensing**

What's Next?

Questions & Comments



Map credit: Colorado River Commission of NV, available via [http://crc.nv.gov/images/colorado\\_river\\_basin.gif](http://crc.nv.gov/images/colorado_river_basin.gif)



Mean 2000-2010 melt period dust forcing, where colors denote the **Central Basin** region, **Eastern Basin** region, and **Northern Basin** region (Bryant-Burgess, 2014)

Nutshell:  
Larger circles indicate more dust, on average

- **Initial focus area = southwestern Colorado (most impacted by dust events)**
- UT and WY are less-impacted by dust events (differences in weather events, dust sources, dust deposition event characteristics...)

# DRFS-informed MAT Adjustments

## Methodology, in a nutshell\*\*:

\*\* → If you want details, just ask!

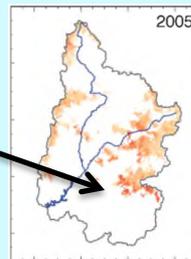


## Preliminary Results for Uncompahgre R. in SW CO – NWS id = UCRC2:

- Minimal (+/- 3%) impacts on water year and seasonal runoff **volumes** (Apr-Jul)
- **Timing** of melt (and snowmelt-driven streamflow) within the April-July runoff period is altered by incorporation of MODDRFS data into SNOW17

## Example cases of runoff timing for SW CO: 2005, 2009

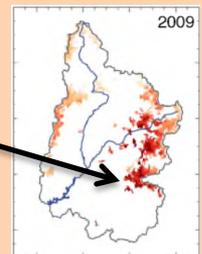
2005 Dust:  
→ Lighter/less than normal



2005 AMJJ runoff volume:  
→ 111% average

Map credit: Bryant-Burgess, 2014

2009 Dust:  
→ Heavier/more than normal



2009 AMJJ runoff:  
→ 118% average

Map credit: Bryant-Burgess, 2014

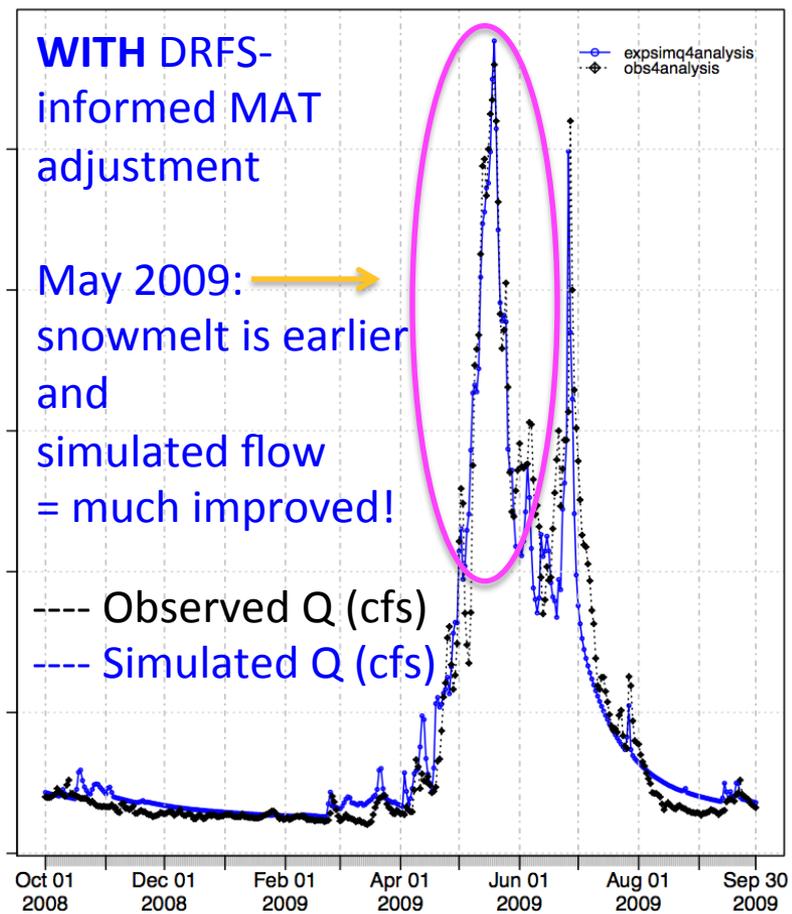
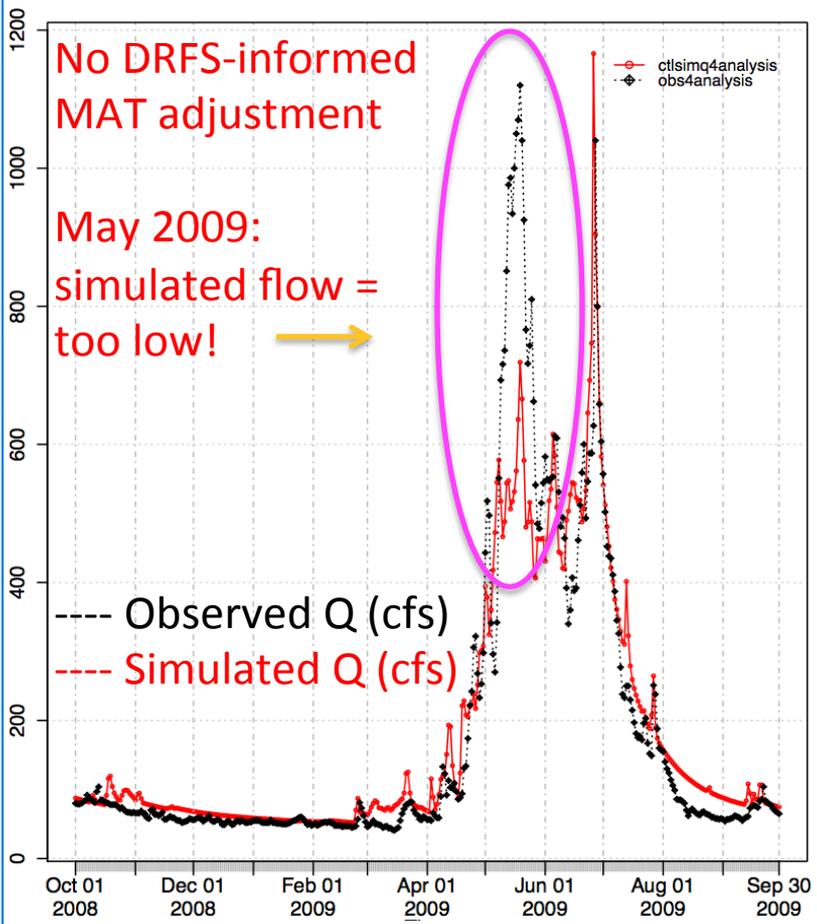
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## Example from initial results:

- Uncompahgre River in southwestern CO (NWS ID = UCRC2)
- WY2009 – “heavy dust” year



# DRFS-informed MAT Adjustments

Breaking down results within the April-July runoff period:

**2005 (minimal dust)**  
**Including "dust on snow" remote sensing info** →

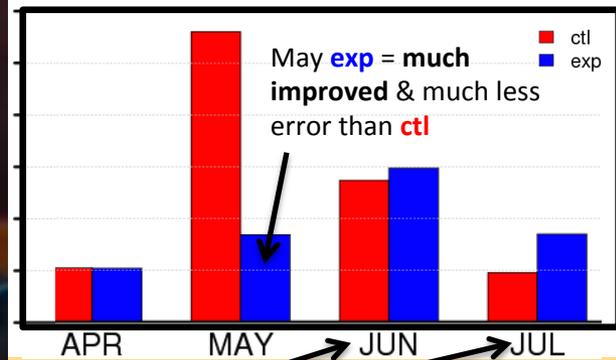
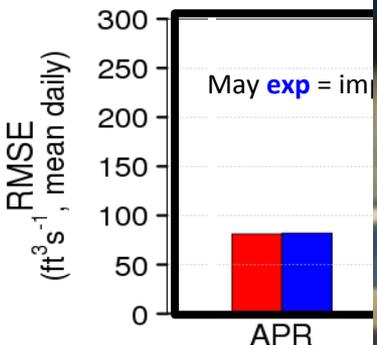
- less runoff
- slightly more

➤ **May = most improvement**



**(heavy dust) Case:**  
**Including "dust on snow" remote sensing info** → accelerated melt  
 much more runoff in May  
 much less in June and July

**May = most improvement in**



**Note:** for 2009: Jun-July (esp July) = **exp** simulation has larger error than **ctl**  
 → to check further into other error sources

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# What's Next?



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<b>What's Next?</b>
Questions & Comments

## For the rest of 2015 (and beyond):

- Work with stakeholders, forecast users, and water managers to share knowledge of snow observations and measurements from perspectives external to CBRFC
- Evaluation of snow model state updating methods (including documentation)
  - SNOTEL-based methods
  - Remote sensing-based methods
- Continue to support expansion of NRCS SNOTEL and other surface-based networks
- Review additional remote sensing datasets (more MODIS datasets, VIIRS, ASO from NASA/JPL) and investigate their best uses at CBRFC
- Investigate more advanced snow modeling
- And other projects



# Questions, Comments, and Acknowledgements



- RFCs
- Importance of Snow Info
- Operational CBRFC Modeling
- CBRFC Uses of Surface Observations
- CBRFC Uses of Remote Sensing
- What's Next?
- Questions & Comments**

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