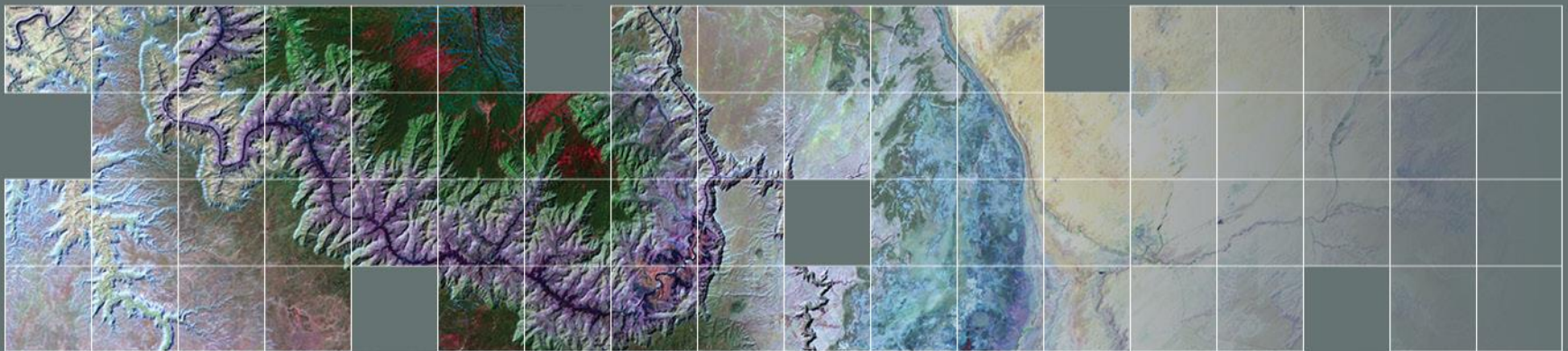




Climate and Land Use Change  
**Earth Resources Observation and Science (EROS) Center**

# The Future of Landsat Data Products: Analysis Ready Data and Essential Climate Variables



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**<sup>2</sup> USGS EROS Center**

**GSA 2016 – Denver, CO**

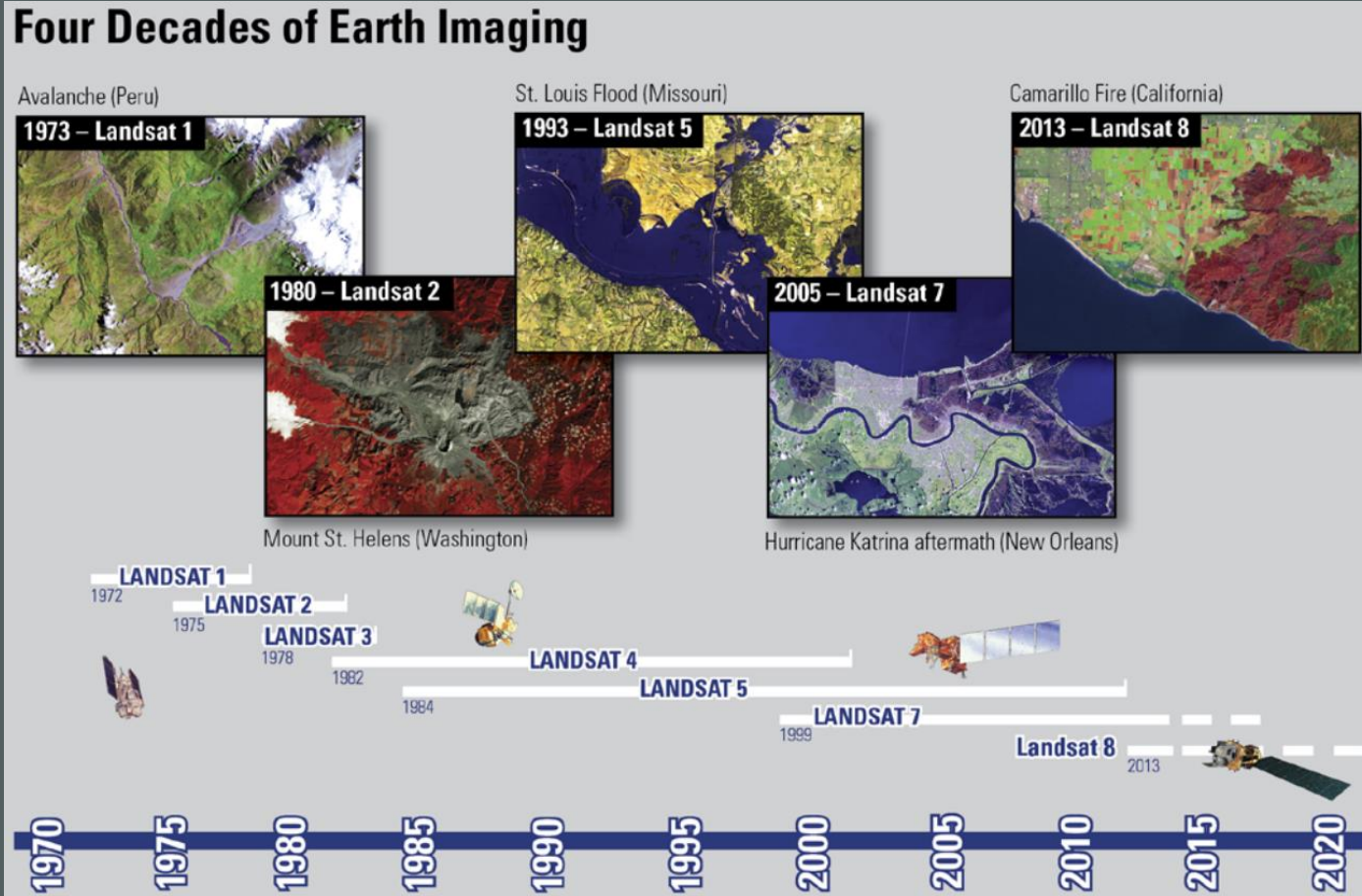
U.S. Department of the Interior  
U.S. Geological Survey

# Outline

- **Status Quo**
- **Essential Climate Variables**
- **Data Improvements**
  - Collections
  - Analysis Ready Data
- **Use Cases**

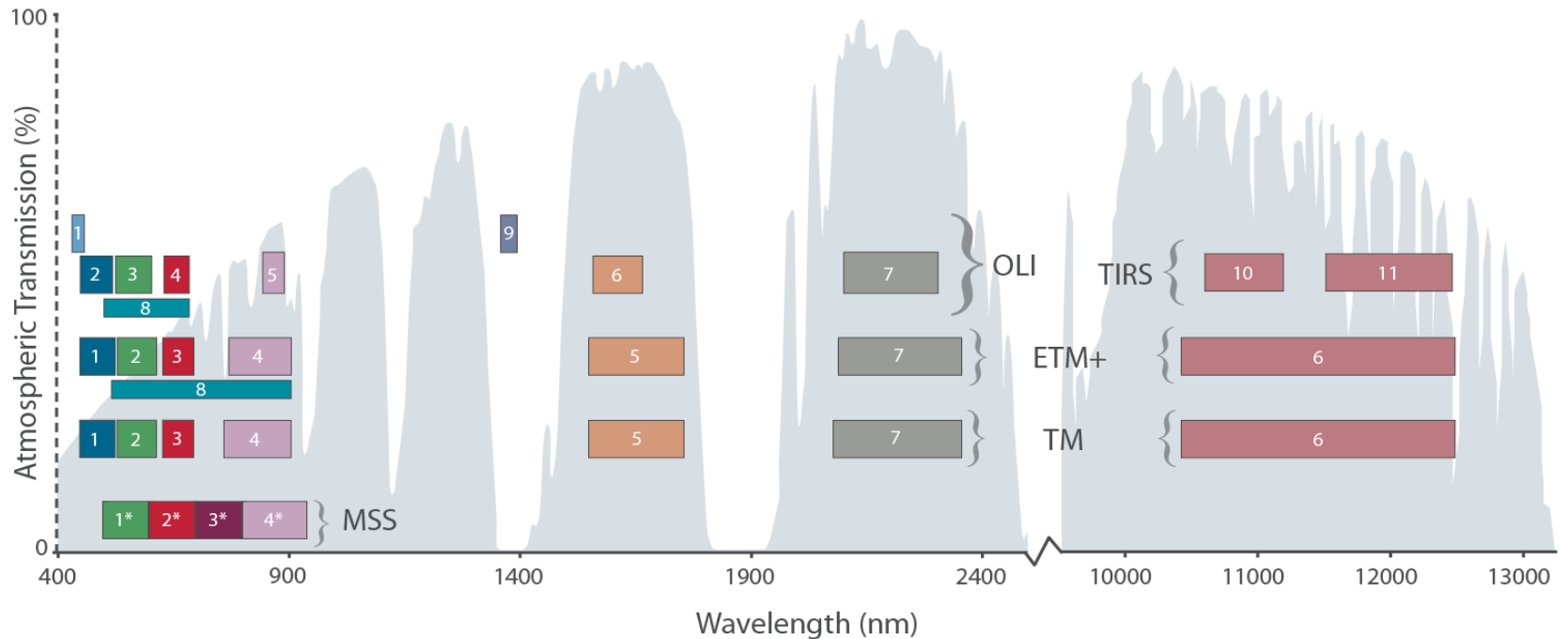
# Status Quo

## ■ Landsat Overview



# Status Quo

## ■ Landsat Bandpasses



\* MSS bands 1-4 were known as bands 4-7, respectively, on Landsats 1-3

**MSS** = Multispectral Scanner (Landsat 1-5); **TM** = Thematic Mapper (Landsat 4-5); **ETM+** = Enhanced Thematic Mapper Plus (Landsat 7); **OLI** = Operational Land Imager (Landsat 8); **TIRS** = Thermal Infrared Sensor (Landsat 8)

# Status Quo

- Development of higher level data products
  - Surface Reflectance (SR)
    - Future: land surface temperature
  - EROS Science Processing Architecture (ESPA)
    - Higher level data products, data customization, statistics
    - On Demand Interface (ODI)
    - Application Programming Interface (API)
    - Order options
      - Vegetation/burn indices
      - Top of Atmosphere Reflectance, SR, cloud masks
      - Reprojection, spatial subset, pixel resizing, multiple formats

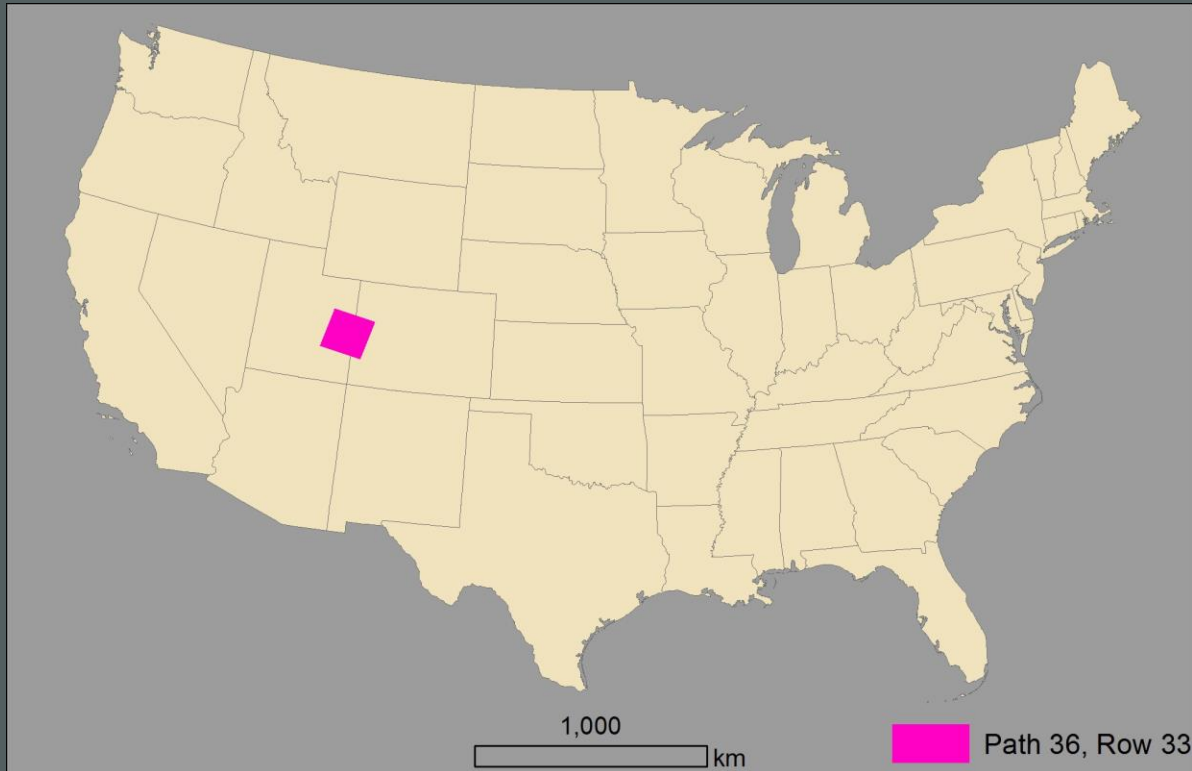
The screenshot displays the ESPA interface with three main sections:

- Climate Data Records:** A list of data products with checkboxes: Top of Atmosphere Reflectance, Brightness Temperature, CFMask, and Surface Reflectance.
- Spectral Indices:** A list of indices with checkboxes: Surface Reflectance NDVI, Surface Reflectance EVI, Surface Reflectance SAVI, Surface Reflectance MSAVI, Surface Reflectance NDMI, Surface Reflectance NBR, and Surface Reflectance NBR2.
- Customize Outputs:** A section titled "Customization Options" containing:
  - Output Format:** Radio buttons for GeoTiff (selected), ENVI, and HDF-EOS2.
  - Reproject Products:** A checkbox.
  - Modify Image Extents:** A checkbox.
  - Pixel Resizing:** A checkbox.

Order interface layout in ESPA.

# Status Quo

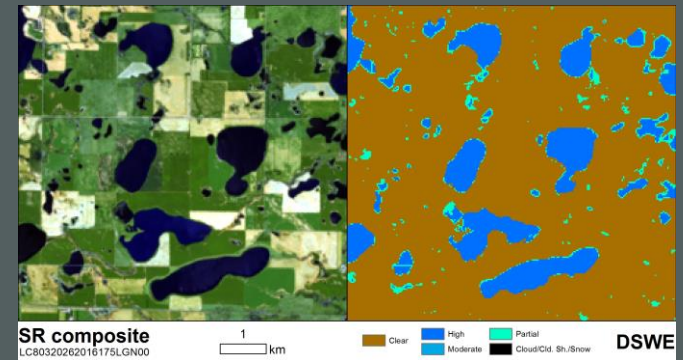
- Data in a “scene”-based format
  - Covers ~180 km<sup>2</sup> of land



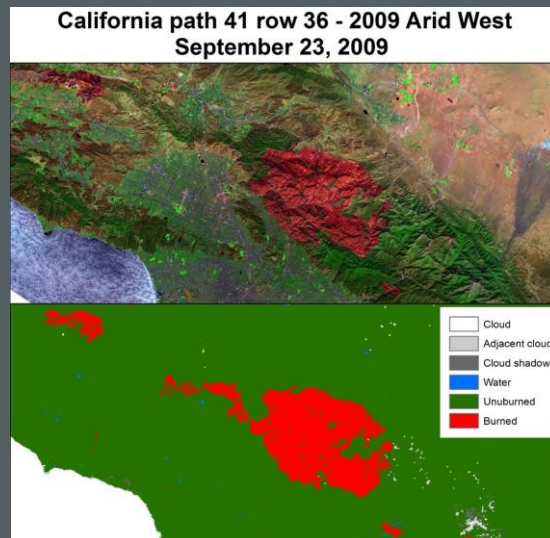
The extent of a single Landsat scene in relation to CONUS.

# Essential Climate Variables

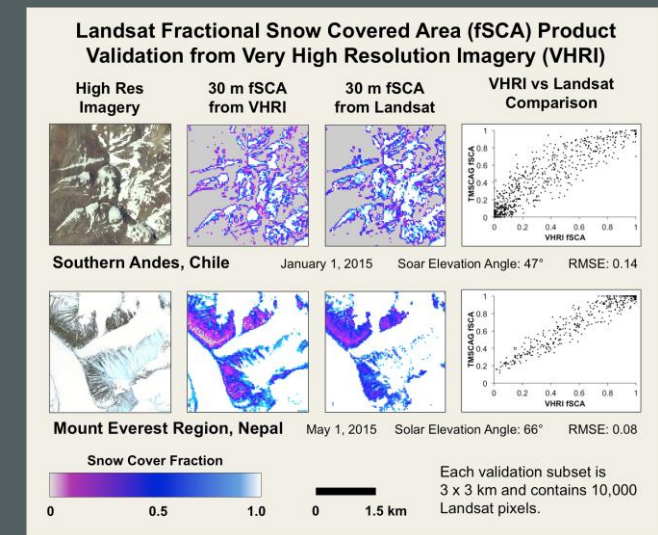
- PIs across USGS
- Physical parameters derived from SR
  - Dynamic Surface Water Extent (DSWE; *Jones, 2015* [1])
  - Burned Area (BA; *Hawbaker et al., 2016* [2])
  - Fractional Snow Covered Area (fSCA; *Selkowitz, 2015* [3])



Dynamic Surface Water Extent (DSWE) probability product shown over glacier lakes in North-central North Dakota.



Burned Area (BA) classification map over burn scar in California. Product also comes as probability product.



Fractional Snow Covered Area probability product and related validation methodology. From *Selkowitz, 2015* [3].

# Data Improvements

## ■ Landsat Collections

### ■ Buckets known as data *tiers*

- Consistent radiometry, threshold of scene-wide geometry
- Tier 1 enables *stackability*
- Best data can be easily accessed without additional metadata harvesting

Tier	Geometric RMSE	Radiometric	% OLI/TIRS	% ETM+	TM
1	≤ 12m	Static	60.42%*	74.98%	65.41%
2	> 12m	Static	39.58%	25.02%	34.59%
RT **	Recently acquired data with preliminary geometry and radiometry information. Will eventually become Tier 1 or Tier 2.				

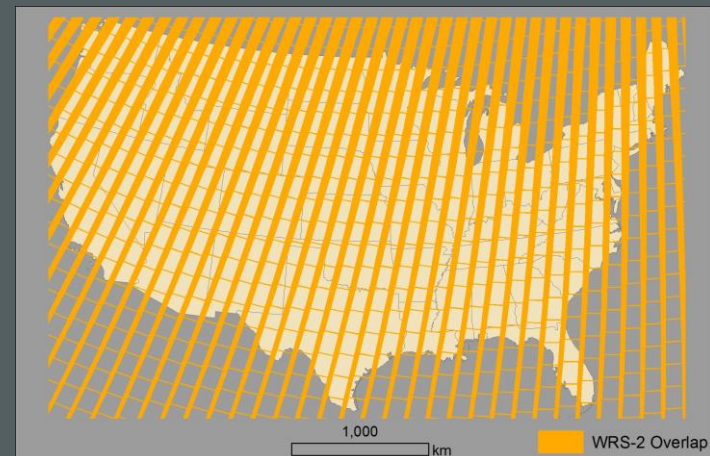
\* Many OLI/TIRS scenes do not reach geometric threshold due to imaging of oceans, where ground control points (GCP) are often not sufficient.

\*\* RT = "Real Time"



# Data Improvements

- **Analysis Ready Data (ARD)**
  - Derived from Collection data
  - To support land use, land change and mapping sciences
  - Data cube
    - Conterminous U.S. (CONUS), Alaska, Hawaii
    - Seamless analysis
      - immediate use of overlapping data
  - Analysis
    - Application Programming Interface
      - API, on-the-fly analysis
    - “Receive answers, not data”



Representation of WRS-2 path/row overlap over CONUS.

# Data Improvements

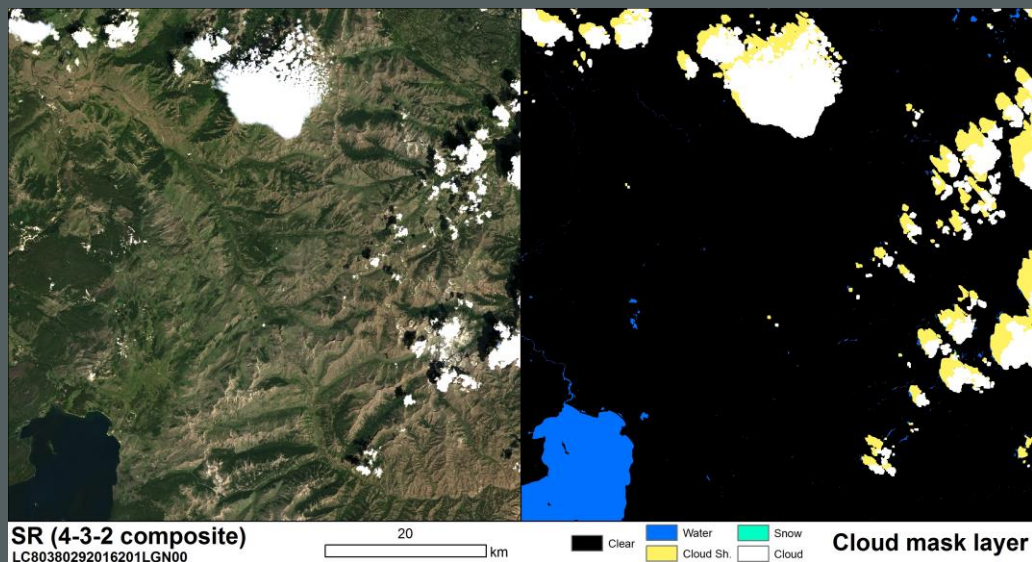
## ■ ARD Specifications

USGS Analysis Ready Dataset (ARD) Product Projection Parameters			
Projection: Albers Equal Area Conic			
Datum: North American Datum 1983 (NAD83)			
	Conterminous U.S.	Alaska	Hawaii
First standard parallel	29.5°	55.0°	8.0°
Second standard parallel	45.5°	65.0°	18.0°
Longitude of central meridian	-96.0°	-154.0°	-157.0°
Latitude of projection origin	23.0°	50.0°	3.0°
False Easting	0.0	0.0	0.0
False Northing	0.0	0.0	0.0

# Use cases

- **Quick visualization**

- Filter pixels by quality assurance (QA) bit(s)
  - Cloud, cloud shadow, snow/ice (below)
  - Saturation, dropped frames, terrain occlusion
- Best pixel by index and/or threshold
  - Series of tests to create probability map(s)
- Composite bands to accentuate features

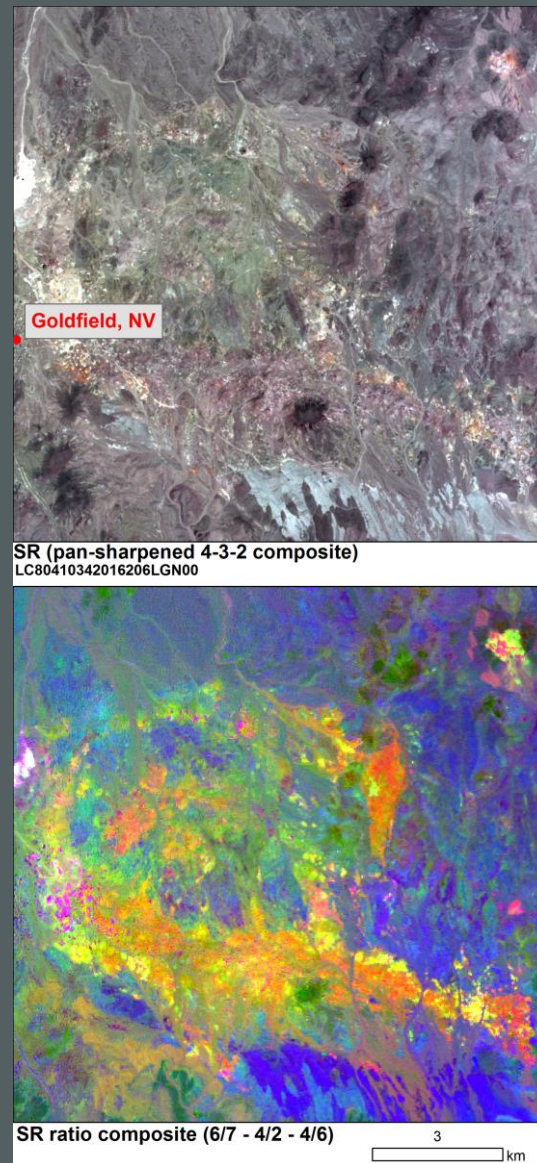


Cloud masking product delivered with Landsat 8 surface reflectance data.  
Image was acquired over Yellowstone National Park, Wyoming.

# Use cases

## ■ Lithology, Hydrothermal Alteration maps

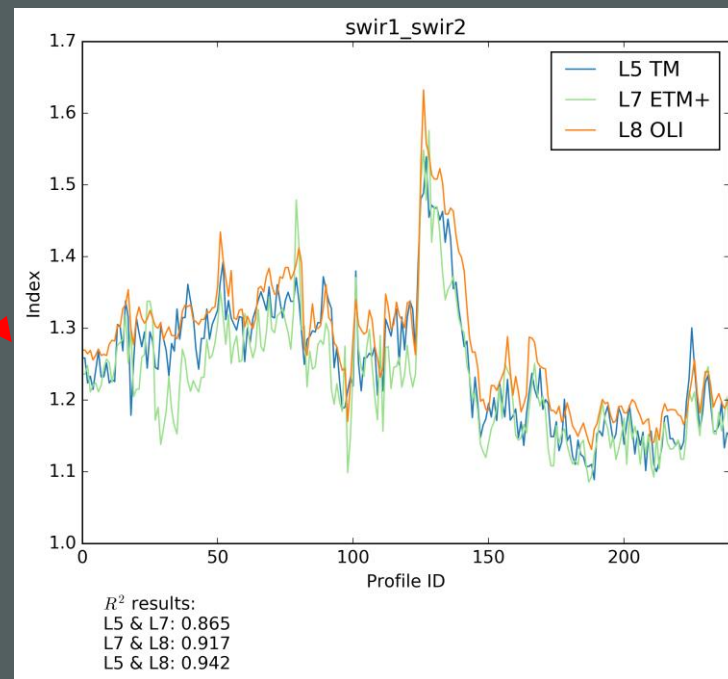
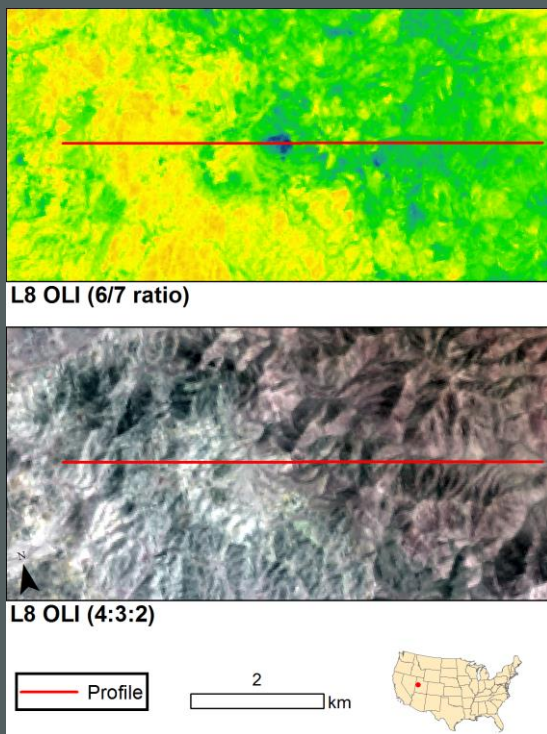
- Color composites of band ratios (right) to show areas of potential alteration
  - Goldfield mining district, NV, based upon work by *Sabins, 1999* [4]
- Use of spectral unmixing (e.g., Principal Components Analysis (PCA)) to abstract distinct signatures using all bands



Band ratio composite using L8 surface refl. data detailing potential hydrothermal alteration (yellow/orange) in Nevada.

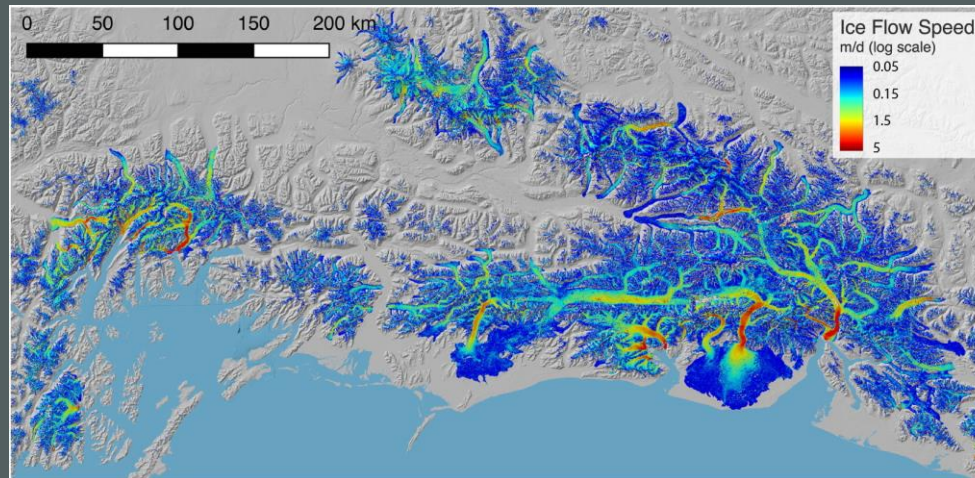
# Use cases

- Sensor compatibility across time
  - Red, Near Infrared (NIR), Shortwave Infrared (SWIR) 1, SWIR2 narrowed from TM/ETM+ to OLI
  - Quick analysis at hydrothermally altered area near Drum Mountain, Utah
    - Sensors still detect same features, thus are cross-comparable



# Use cases

- **Derive glacier velocities with feature tracking**
  - Landsat 8 OLI ideal for this
    - High signal-to-noise ratio (SNR)
      - High enough to track snow drifts [5], not just crevasses
    - 15m panchromatic bands (sharper detail)
    - Repeat imaging opportunities
      - Converging fields of view with polar orbit
      - Ascending node imaging during midnight sun at poles
  - Seamless base image creation with ARD



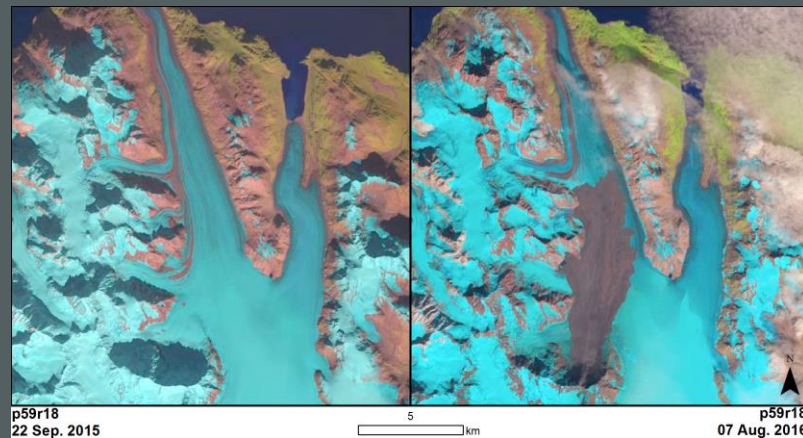
Velocity profile of southern Alaska glaciers, derived from OLI images. Borrowed from *Fahnestock et al., 2015* [5].

# Use cases

- Hazards
  - Quickly compile time series to show before/after
  - Composite with SWIR to reduce smoke (below)



Holuhraun lava flow in Iceland captured by Landsat 8. Left: SWIR,NIR,green composite. Center: red,green,blue composite. Right: thermal. Image modified from [http://eros.usgs.gov/imagegallery/image-week-2#iceland\\_images](http://eros.usgs.gov/imagegallery/image-week-2#iceland_images).



Before (left) and after (right) of landslide at Glacier Bay National Park and Preserve in Alaska captured by Landsat 8.

# Resources

- Landsat mission webpage: <http://landsat.usgs.gov>
  - Collections: <http://landsat.usgs.gov/landsatcollections.php>
- Landsat data: [http://earthexplorer.usgs.gov/](http://earthexplorer.usgs.gov)
- EROS Science Processing Architecture (ESPA): [https://espa.cr.usgs.gov/](https://espa.cr.usgs.gov)



# References

- [1] Jones, J. W. (2015). Efficient wetland surface water detection and monitoring via Landsat: Comparison with in situ data from the Everglades Depth Estimation Network. *Remote Sensing*, 7(9), 12503-12538.
- [2] Hawbaker, T., Vanderhoof, M., French, N., Billmire, M., Beal, Y. J. G., Takacs, J., ... & Caldwell, M. (2016, April). Automated mapping of burned areas in Landsat imagery; tracking spatial and temporal patterns of burned areas and greenhouse gas emissions in the Southern Rocky Mountains, USA. In *EGU General Assembly Conference Abstracts* (Vol. 18, p. 10709).
- [3] Selkowitz, D. (2015, December). The USGS Landsat Snow Covered Area Science Data Products. In *2015 AGU Fall Meeting*. AgU. Image accessed 01 AUG 2016 from <http://landsat.gsfc.nasa.gov/?p=11702>.
- [4] Sabins, F. F. (1999). Remote sensing for mineral exploration. *Ore Geology Reviews*, 14(3), 157-183.
- [5] Fahnestock, M., Scambos, T., Moon, T., Gardner, A., Haran, T., & Klinger, M. (2015). Rapid large-area mapping of ice flow using Landsat 8. *Remote Sensing of Environment*.