

**REVEALING INSIGHTS** 

# **Automated Cloud Mask Ensemble**

Dr. François G. F. Smith Radiant Solutions

ACIXII – CMIX Meeting

October 17, 2018 Washington DC

#### Overview



- Submitting an experimental method
- Not "official" Radiant Solutions method
- Haze is not extracted
- Processing performed at 30m resolution
- Originally designed to recreate the CFMASK for S-2 imagery
- Highly accurate automated cloud/cloud shadow mask is crucial to our production

## **Inputs and Outputs**



• Works for Landsat or Sentinel-2 imagery

• TOA

- S-2 imagery is resampled to 30m resolution
- For both Landsat and S-2
  - 6-bands layerstacked
  - B,G,R,NIR, SWIR1, SWIR
  - Also uses a thermal band if Landsat
- Output is CFMASK classification
  - 0 = Clear
  - 1 = Water
  - 2 = Cloud Shadow
  - 3 = Snow/Ice
  - 4 = Cloud
  - 255 = No Data

#### **Pre-processing Steps**



- TOA
- Terrain Normalization
- Mask Ocean from coastal scenes
- Water mask
- Snow/Ice mask
- ISODATA
  - Stretch imagery
  - Threshold for albedo
- Blue Shift
  - Shadow extraction
- Cirrus band threshold
- Cloud Ratios
  - B/SWIR1 (or thermal if Landsat)
  - NIR/SWIR1
  - NDVI
- Tasseled cap transformation

## **Change Detection**



- Cross Correlation Analysis (CCA)
- Statistical approach measuring variation of late-date DN values from strata means where strata are derived from the early-date imagery
- No direct comparison of imagery
- Output is a 16-bit Z-score layer correlated to probability of change
- Usually threshold layer to create binary change using an empirically derived universal coefficient

# **Classification Steps**



- CART Classification
- Training modeled from derived layers
  - Cloud
    - Z-scores
    - ISODATA high albedo
    - Cloud ratios
    - Remove snow/ice
  - Shadow
    - Z-scores
    - Blue-shift
    - ISODATA low albedo
    - Remove water
- Independent variables derived from imagery,
  - Tasseled cap transformation
  - Band Ratios
  - Z-scores

#### **Post-processing steps**



- Ruleset #1 to refine cloud and cloud shadow layer
- Cloud/Cloud shadow matching algorithm based on solar elevation and azimuth to refine cloud shadow mask
- Ruleset #2 to refine those results and build CFMASK classification
- Morphological filters

# **Typical Issues**

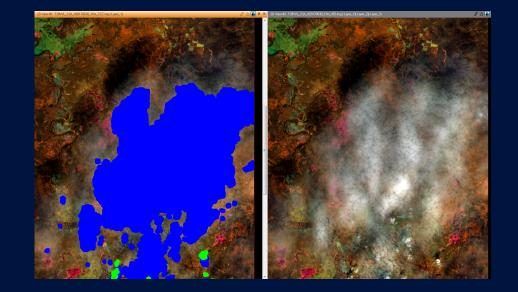


- False positives:
  - High albedo sandy shoreline, bare soil, or urban structures confused with cloud
  - Terrain and building shadow, asphalt, and deep dark water confused with cloud shadow
- False negatives:
  - Small clouds and shadows get filtered out and missed
  - Cloud shadow gets missed regularly
- Cloud accuracy is higher than shadow accuracy

## Potential issues to think about as a group

solutions

- Where to draw the line?
- Boundary of a cloud extent?
- If you can see features through hazy cloud, leave it?
- If any pixels are impacted, should they be removed?
- Do we care if we miss cloud shadow over water?
- Many approaches are tunable and can be adjusted to fit desired output
- Parameters depend on application
  - Land cover, often best to undercall
  - Change detection, best to overcall



#### Thank You



- Contact info:
  - Dr. François G. F. Smith
  - Francois.smith@radiantsolutions.com
  - 240-833-8262