

# Spectral Target Detection at Twilight

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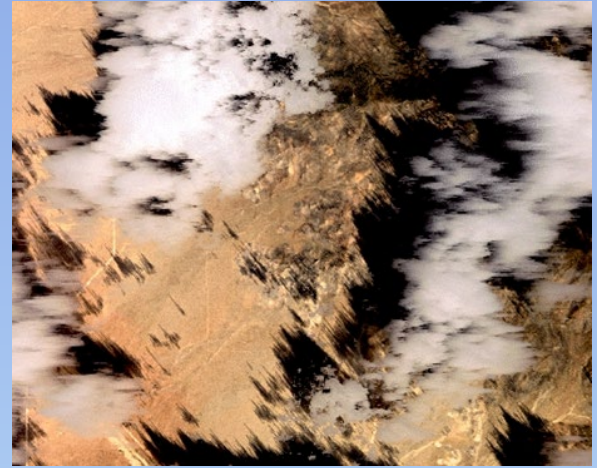
# Presenter's Resume

- Dr. Robert L. Sundberg
- Experience at Spectral Sciences, Inc.
  - President Emeritus (2022-Present)
  - President (2011-2021)
  - Vice President of Technology (2002-2011)
  - Group Leader of Detection/Discrimination Group (1998-2002)
  - Principal Scientist (1988-1998)
- Education
  - Post Doctoral Position, Massachusetts Institute of Technology (1983-1985)
  - Ph.D. (Physical Chemistry), University of California, 1983
  - B.A. (Chemistry & Physics), Colby College, 1978



# Research Interests

- Remote Sensing
  - Spectral Scene Simulation
    - High-fidelity 3D simulations
    - Real-time target simulations
  - Atmospheric Compensation of Spectral Data
    - Visible-SWIR
    - MWIR-LWIR
  - Target Detection Algorithm Development
- Rocket Plume Radiance Simulations
- Calibration of Spectral Sensors

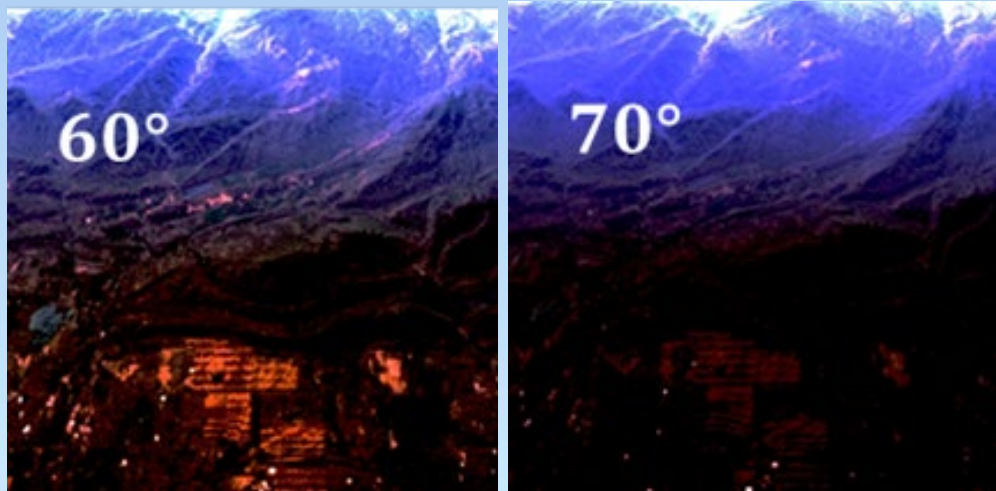


**Temperature Controlled  
Calibration Panels**





## Motivation for Study



- Improvements in Spectral Imager Technology is Allowing Data to be Acquired Under Twilight Illumination Conditions
- MCScene Spectral Scene Simulation Tool can Simulate Scenes with the Sun Below the Horizon
  - Photons reaching the sensor from the ground must scatter in the atmosphere
- Investigate Target Detection Under Twilight Lighting Conditions

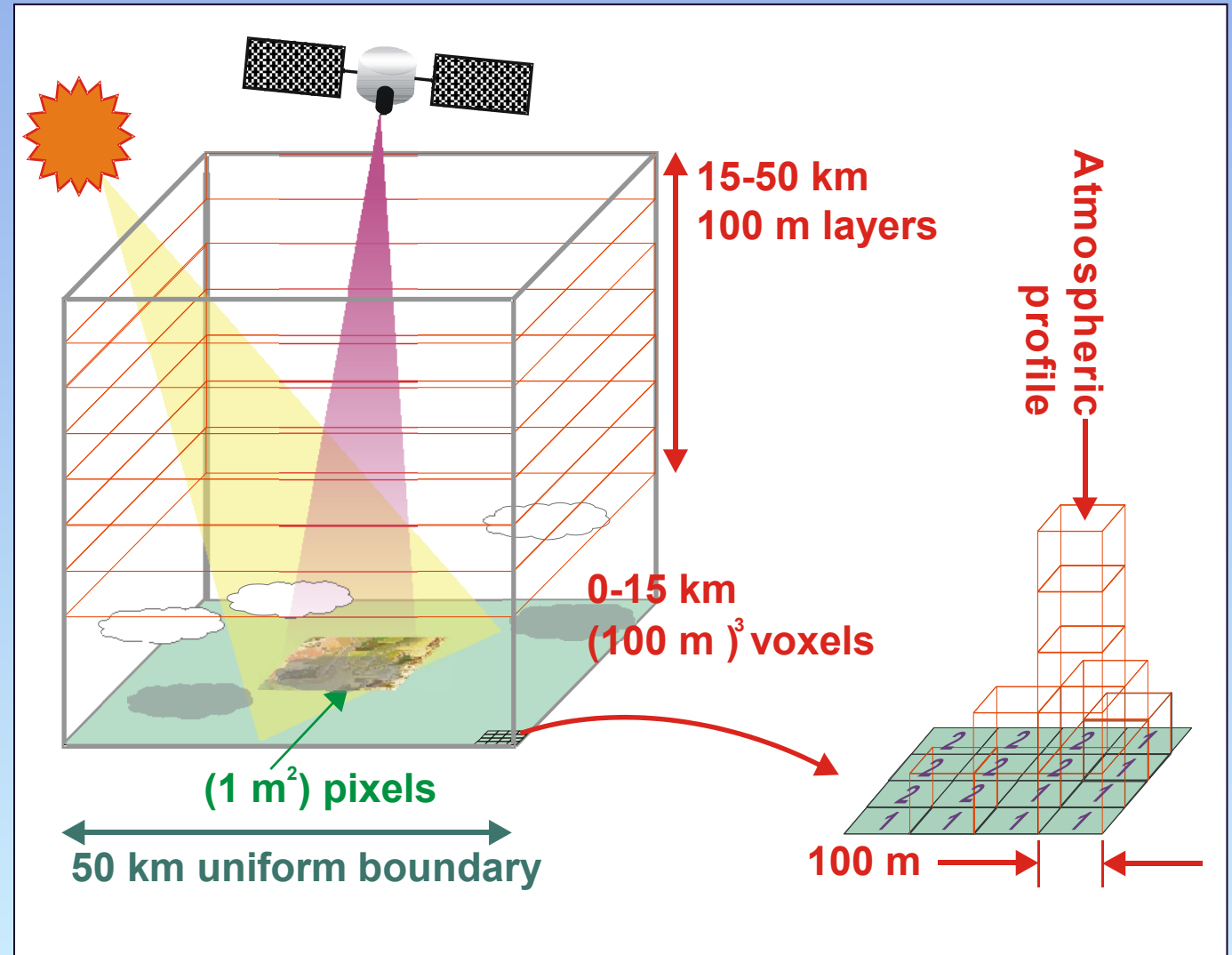
Setting Sun Over Fort Collins, CO, USA

# Presentation Outline

- Motivation
- **Overview of the MCScene Simulation Tool**
- Examine Target Detection Under Twilight Illumination
- Summary

## MCSceen Simulation Tool

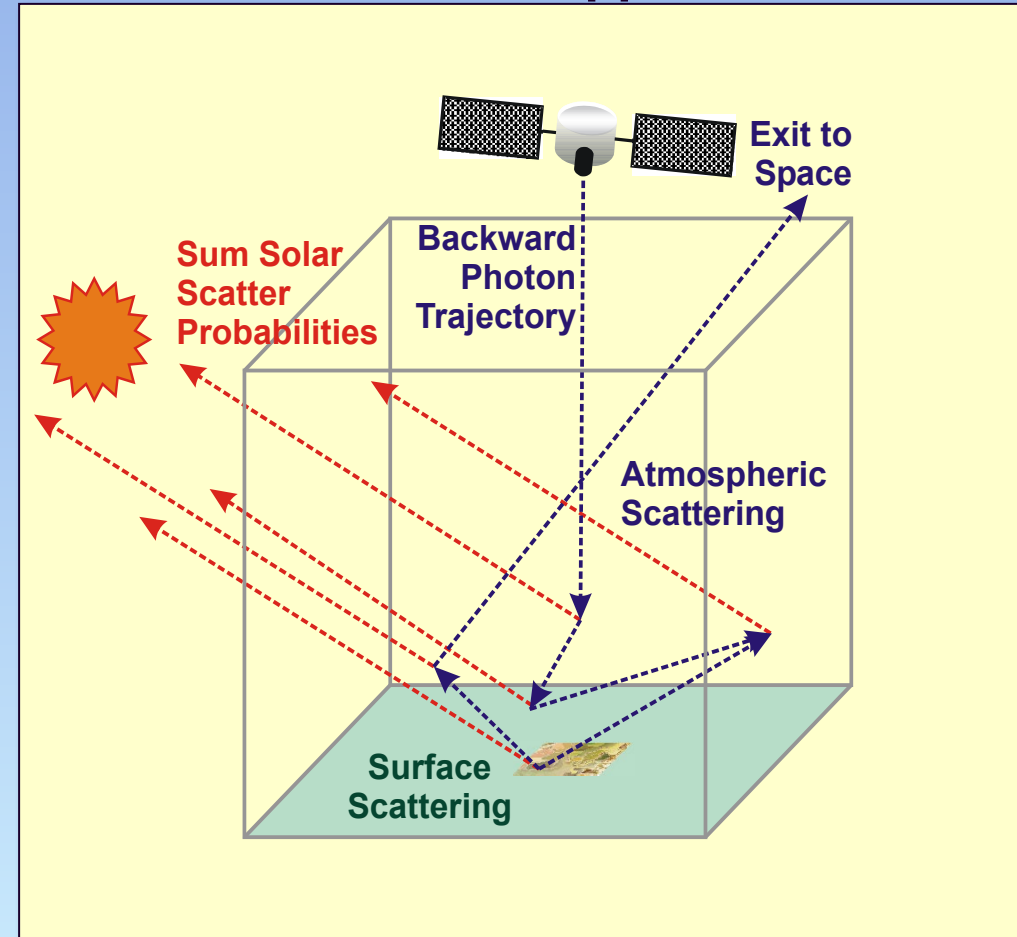
- UV through LWIR 3D radiative transport
- 3D atmospheres with clouds, 3D surfaces and object insertion
- Molecular absorption, Rayleigh scattering, aerosol absorption and scattering, multiple scattering and adjacency effects
- **MODTRAN**<sup>®</sup> optical properties, profiles, and spectroscopy
- Land and water surfaces, 3D terrain and objects, scattering by and transmission through clouds



# MCScene Reflective Domain Approach

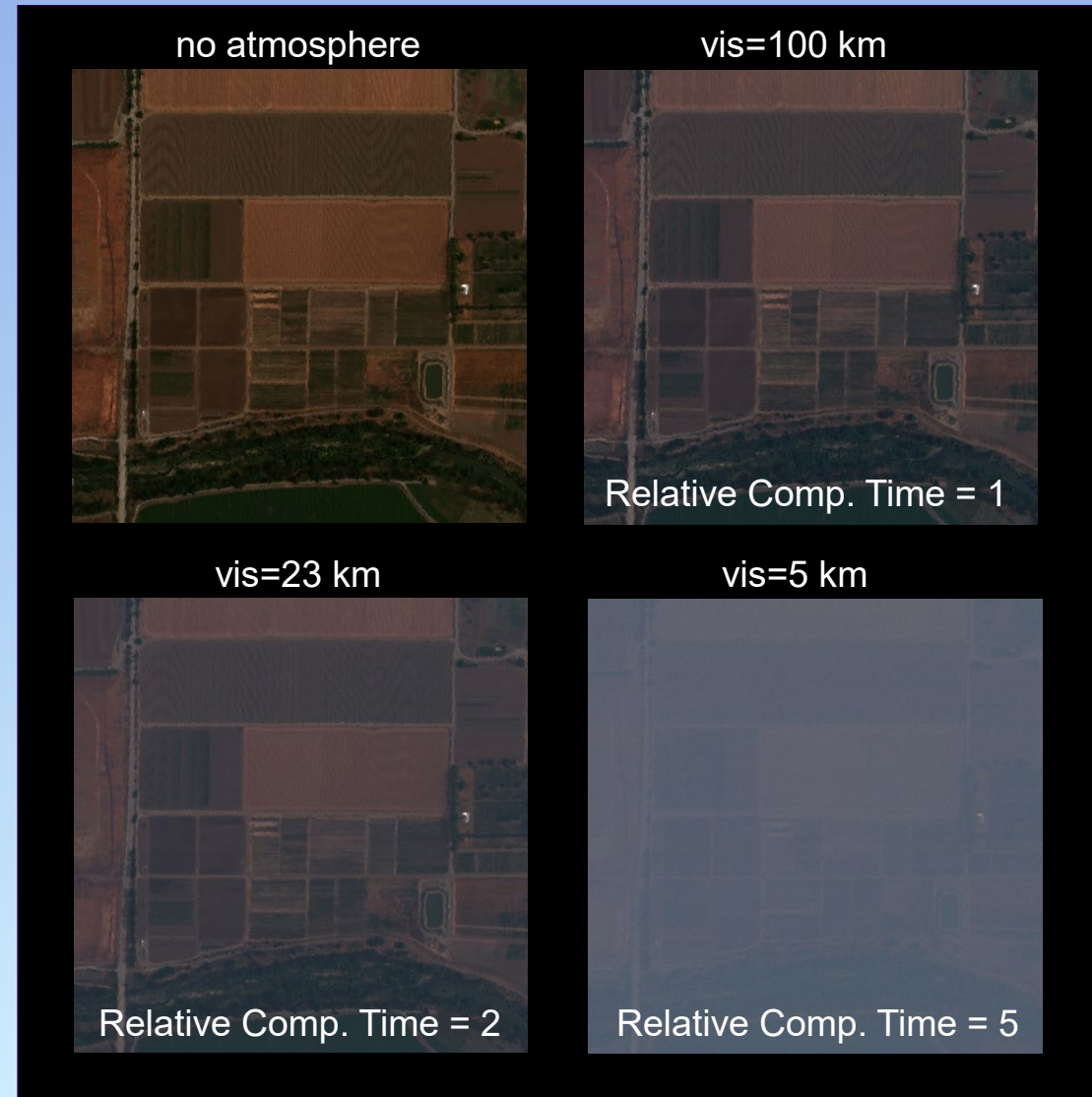
- Direct sun-ground-sensor term calculated explicitly
- Backward simulation ensures all photons hit the sensor
- Integrate thru 3D world in small steps
- Sample probability distributions for distance traveled and atmospheric and surface scattering directions
- Generates hyperspectral imagery

## Monte Carlo Approach



## Example Simulation of Visibility

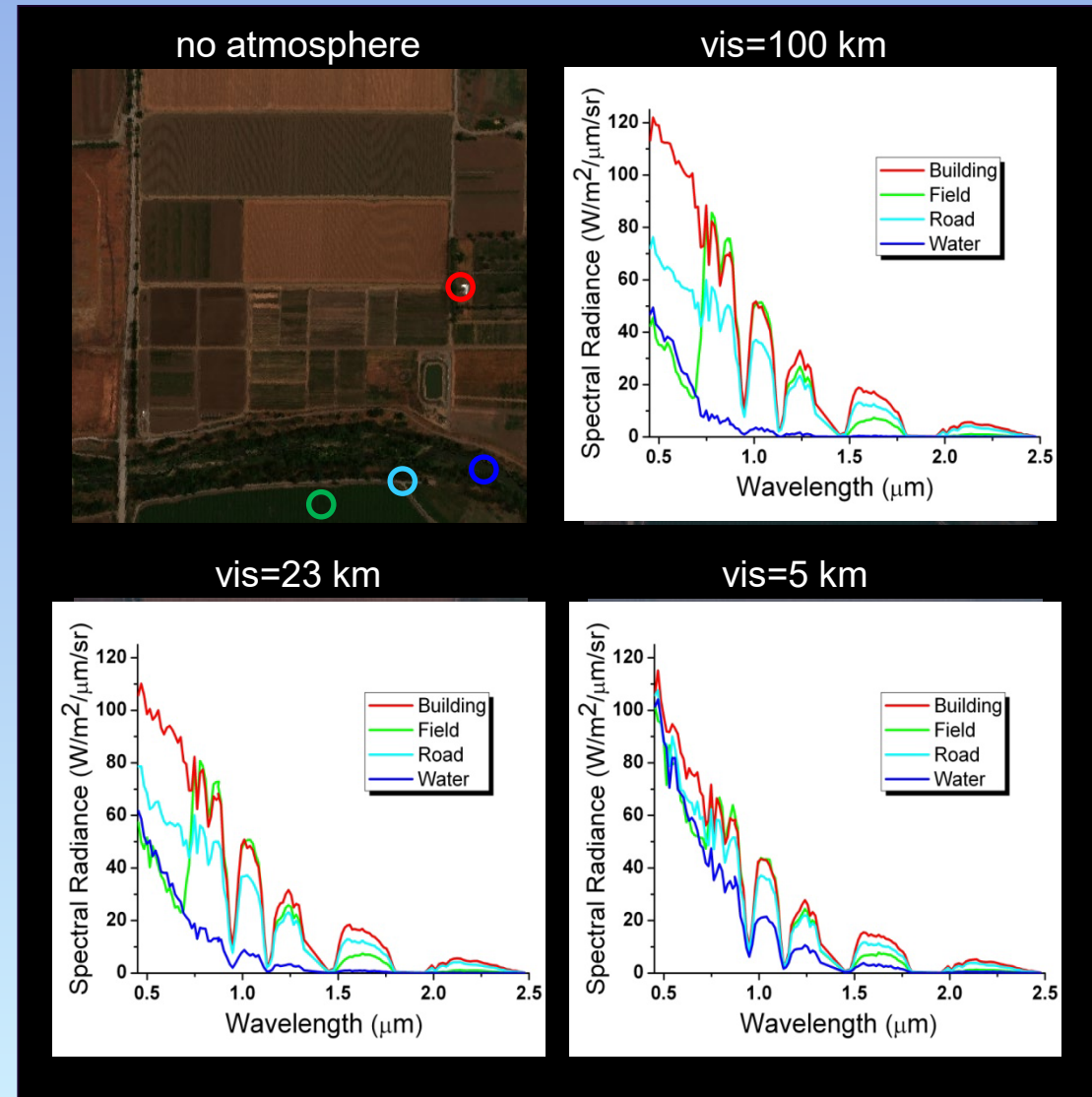
- Davis CA scene
  - Reflectance from HYMAP data
  - 121 spectral bands
  - 2.75 m GSD
- Sensor altitude
  - 50 km
  - nadir view
- 45 deg solar zenith angle
- Uniform atmosphere
  - Mid-latitude summer
  - Rural aerosol
- Reflectance outside of scene is assigned the in-band average





## Example Simulation of Visibility

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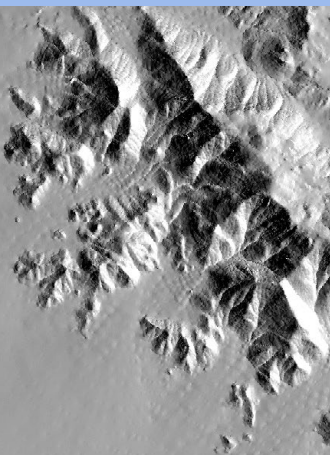


# Topological Shadows

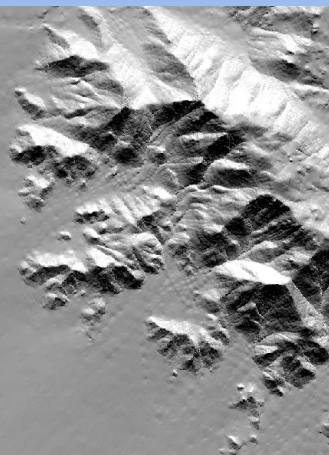
## Shadows Cast by Scene DEM

Varying Solar Azimuth Angle

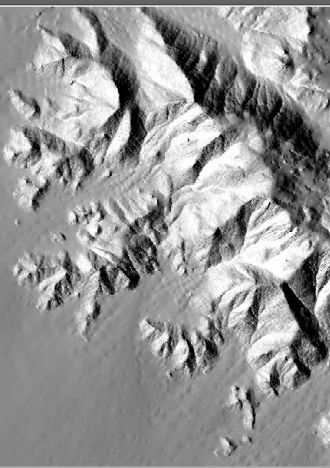
0°



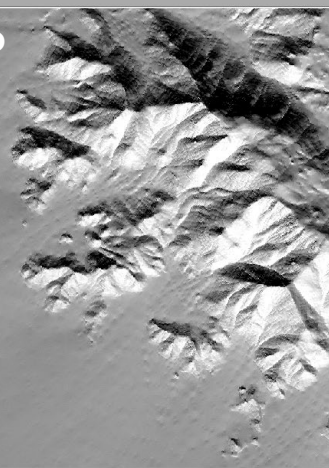
90°



180°

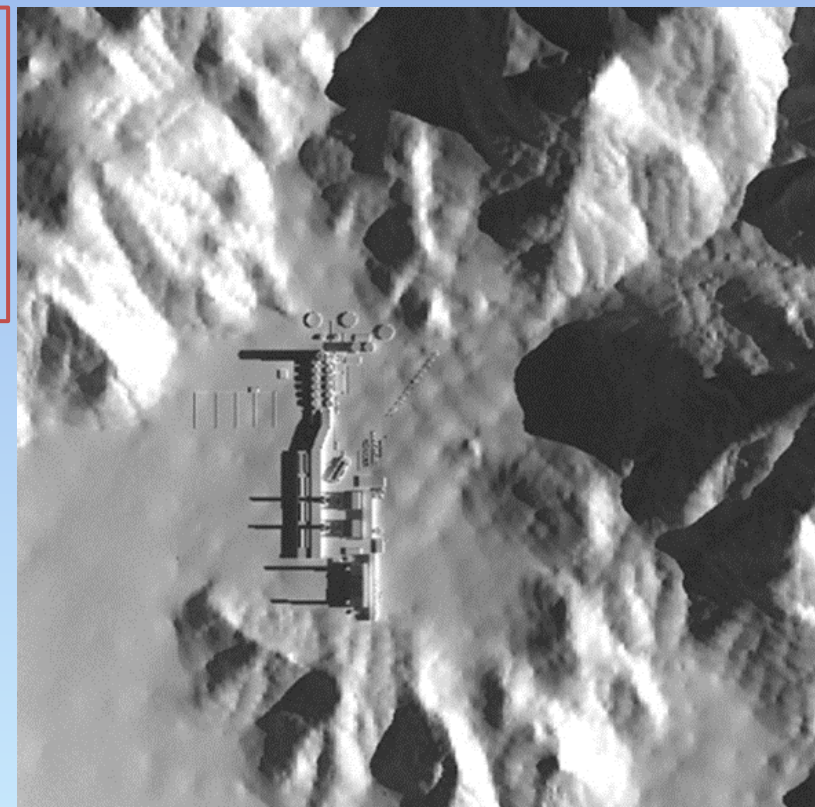


270°



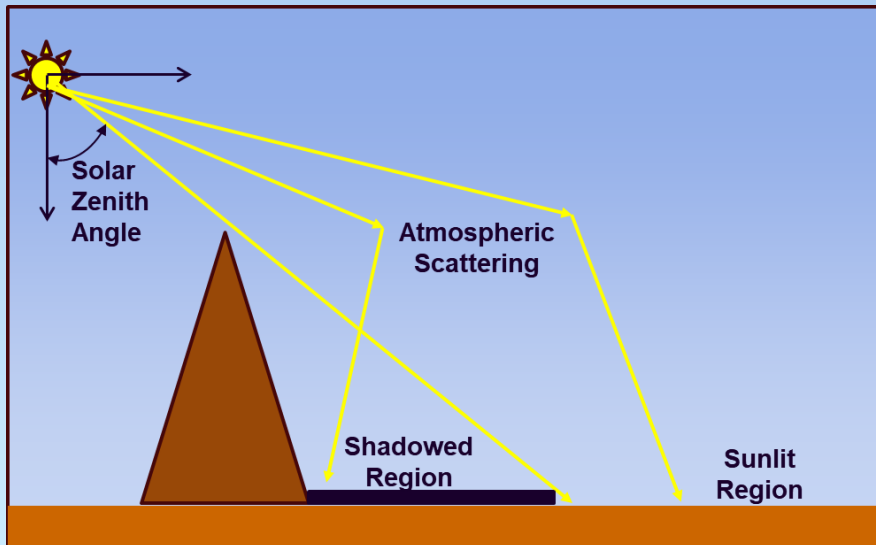
- Virgin Mts. USGS 10 m DEM
- Uniform Unit Reflectance
- 30 deg solar zenith angle
- 20 km sensor altitude

Embedded Power Plant



# Topographic Shadows

- Simplified Topographic Simulation Scenario
  - Tall mountain placed to the west of RIT Blind-Test data
  - Vary solar zenith angle
    - Overhead to  $90^\circ$  (twilight)
    - Scene fully shadowed by  $75^\circ$

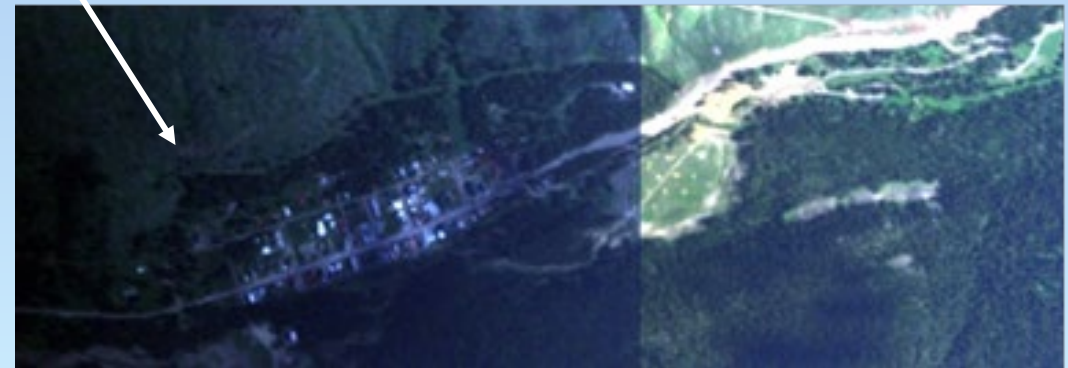


30° Solar Zenith



Shadow

60° Solar Zenith



Linear Stretch on RGB Images

# Presentation Outline

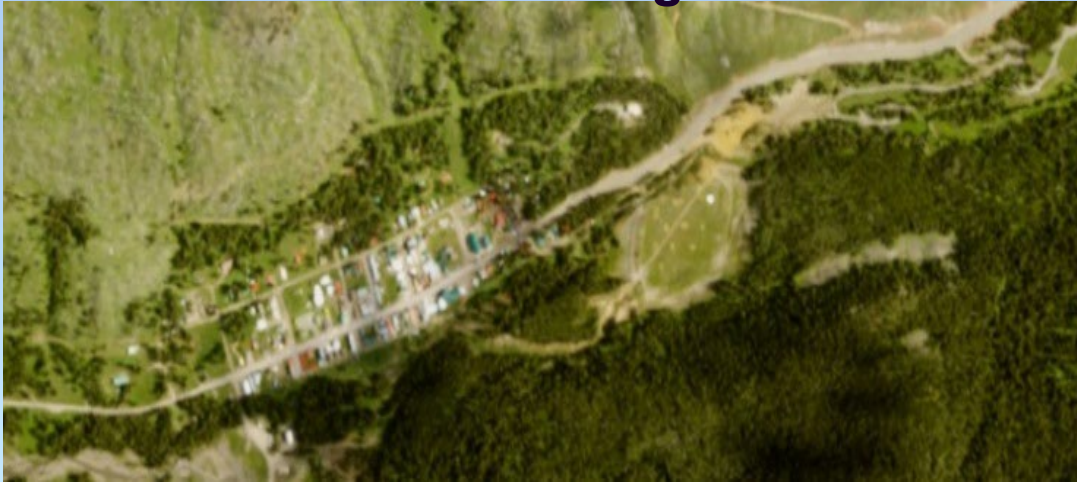
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## Data Used In Study

- RIT Target Detection Blind Test
  - Cooke City, MT
  - Collected on July 4, 2006
  - 3 m GSD
  - HyMap 128 bands
  - Visible to SWIR
- AVIRIS Boreal region in Saskatchewan, Canada
  - Collected 1994
  - 20 m GSD
  - 256 bands resampled to 128 bands
  - Visible to SWIR

### True Color Image



E. Ientilucci & S. Adler-Golden,  
IEEE Geosci. Remote Sens. Mag., vol. 7, no. 2, pp. 31-50, 2019

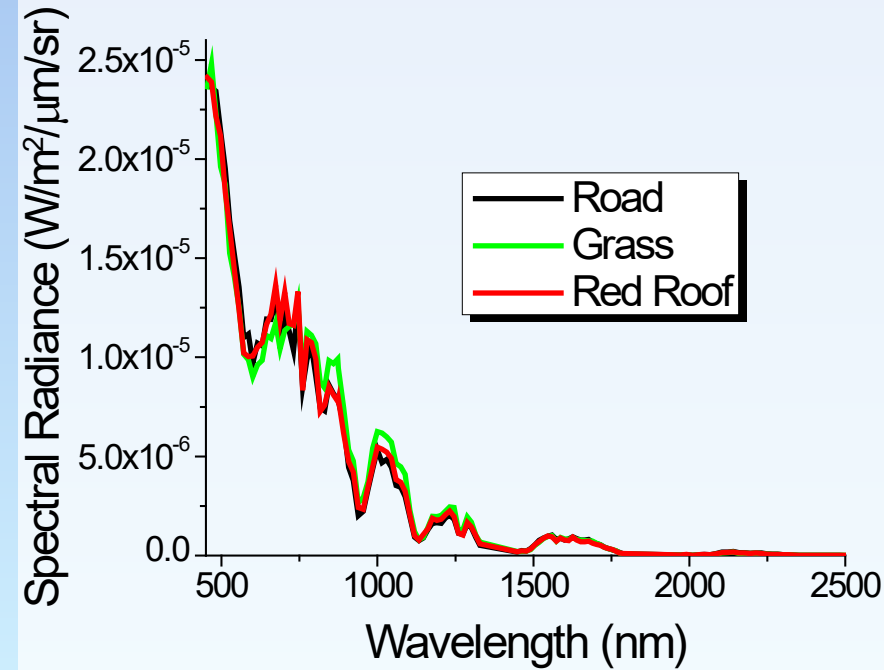
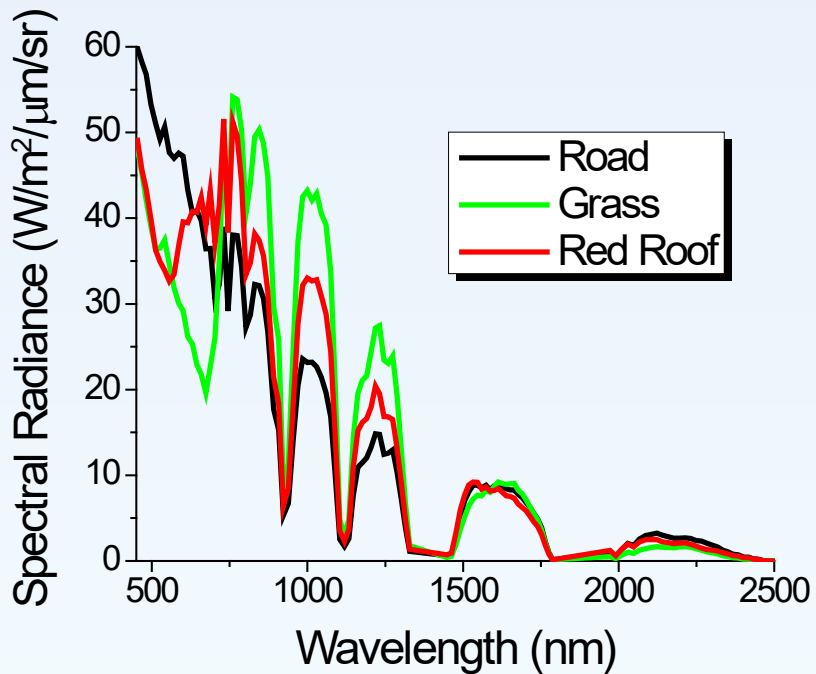


# Simulated RIT Blind-Test Scenes

## Sensor at 20 km Altitude

Nadir Sun (0° Solar Zenith)

Twilight (90° Solar Zenith)

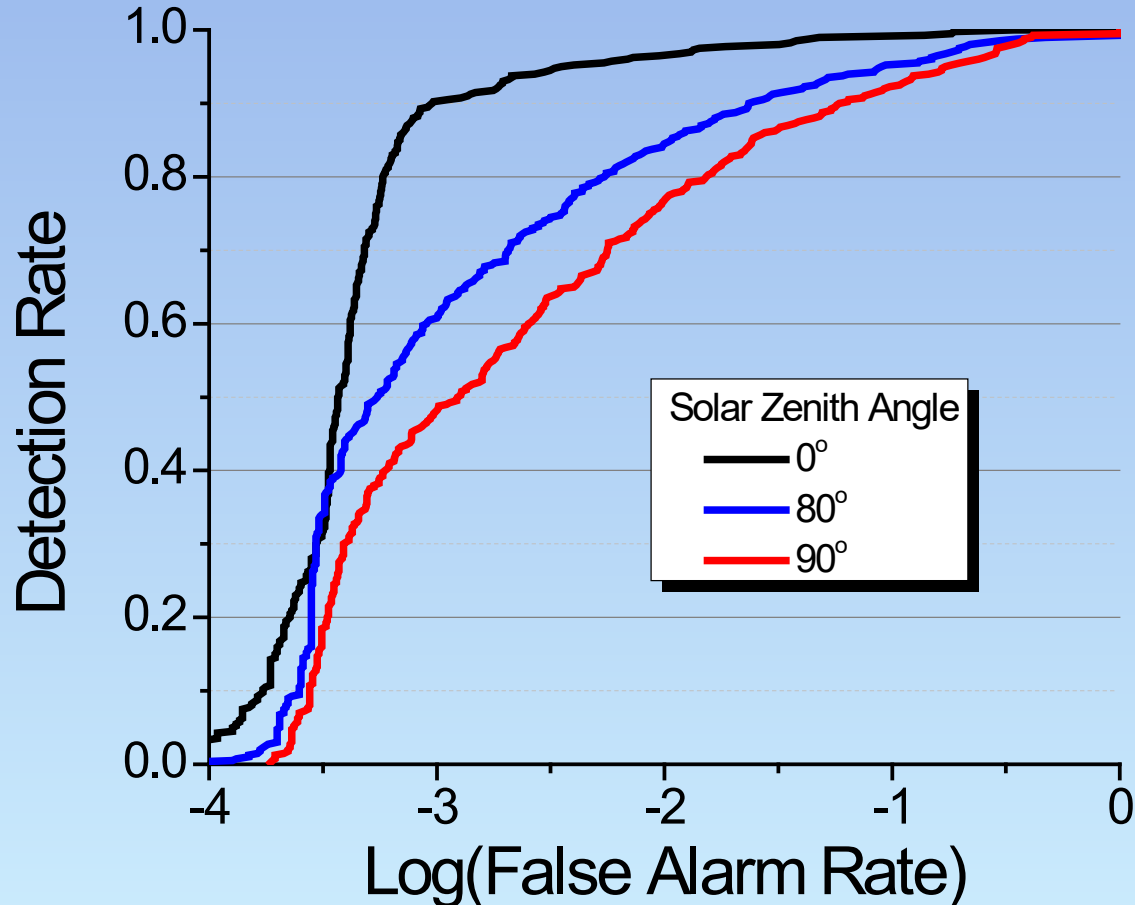


# Target Detection Approach

- Randomly Embedded Target Pixels in Reflectance Scene as Subpixel Targets
  - Blue roof target in RIT scene
  - 400 targets
  - 2% to 10% fill factor
    - Such low fill factors because the target is so spectrally different than most of scene
- Use MCScene to Produce Radiance Scene
  - Move sun from overhead to twilight (below the horizon)
- Atmospheric Compensation from Radiance to Reflectance with QUAC
  - In-scene atmospheric compensation
  - Determines average scene radiance based on automatically selected scene endmembers
- Target Detection Adaptive Covariance Estimator (ACE)
  - Compares whitened target spectrum with each whitened pixel spectrum

# Target Detection Results

## MCSceen Results on Blue Roof Target



- Target Detection Performance Degrades with Lower Solar Illumination
- Scenes with Mixtures of Shadow and Sunlit Areas Generally have Poorer Detection Performance
  - Processing sunlit & shadowed regions separately can improve detection performance
- Twilight Scene can Still Produce Reasonable Detection Performance
  - Radiance signatures are  $10^6$  times smaller
  - Noise of sensor becomes dominant effect



# Simulated Boreal Scenes

Sensor at 20 km Altitude

45° Solar Zenith

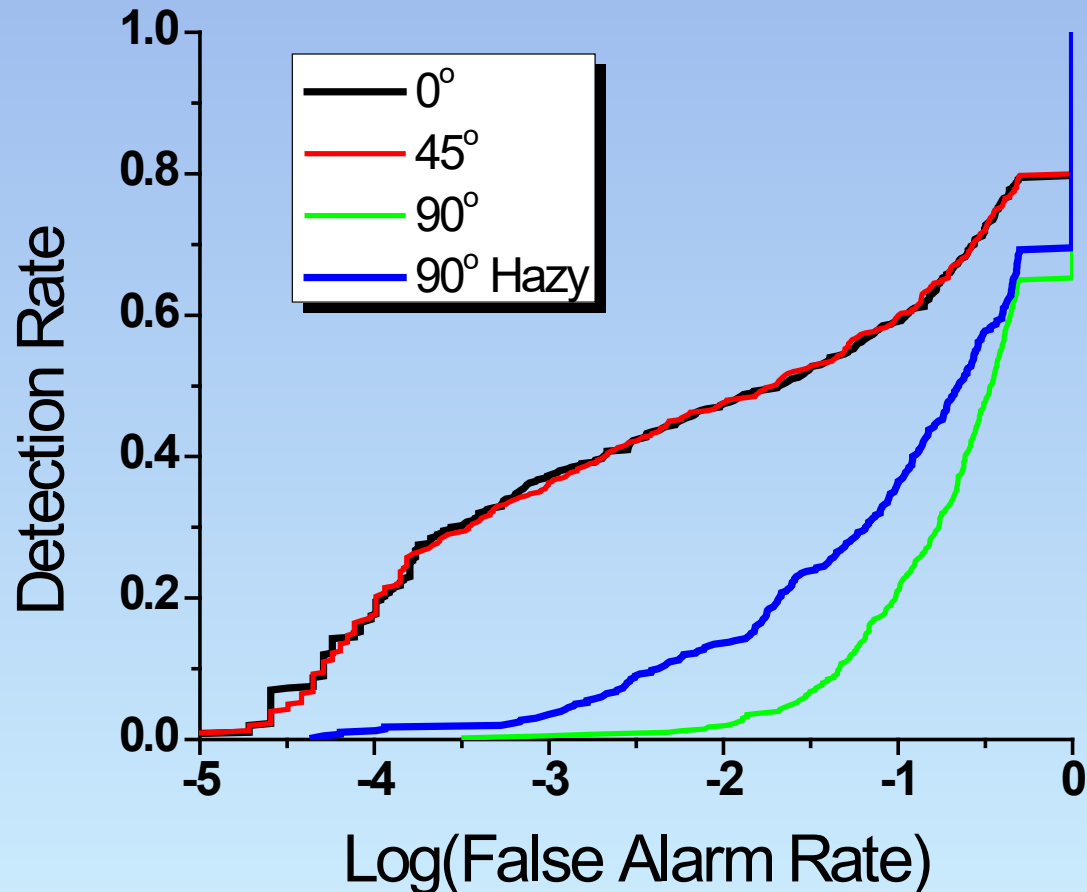


Twilight (90° Solar Zenith)



# Target Detection Results

## MCSceen Results on Blue Roof Target



- Target Detection Performance Degrades with Lower Solar Illumination
- Twilight Scene can Still Produce Reasonable Detection Performance
- Scene with More Haze Produced Better Detection Performance
  - Additional scattering increased the number of photons reaching the ground
  - 23 km visibility in hazy scene

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# Summary and Future Work

- MCScene Simulations of Twilight Illuminated Scenes
  - Sun can be placed below the horizon
  - Investigated the influence of illumination effects on target detection after atmospheric compensation
- Radiance Scene Converted to Reflectance using QUAC
  - Detection is done in reflectance space
- Detection Performance Generally Reduced with Reduced Illumination
- Surprisingly, Good Target Detection in Twilight Conditions
  - Sensor noise may limit the performance
- Improved Detection Results When Haze in the Atmosphere is Sufficient to Induce a Few Scattering Events
- Future Work
  - Investigate sensitivity of twilight illuminated target detection to target signatures

# Acknowledgment

- Spectral Sciences, Inc. for IRAD funding for paper preparation and presentation
- Drs. Steven Richtsmeier and Alexander Berk and Mr. Tim Perkins of Spectral Sciences, Inc. for many helpful discussions

# Detection Algorithms

- Adaptive Coherence Estimator (ACE) Detector
  - Single spectrum for target
  - Can be used for tracking if spectral shape is nearly constant
  - ACE detector:  $\mathbf{r} = [ \mathbf{x}^T \mathbf{x} / (\mathbf{x}^T \mathbf{x} - \mathbf{x}^T \mathbf{s} (\mathbf{s}^T \mathbf{s})^{-1} \mathbf{s}^T \mathbf{x}) ]^{1/2}$ 
    - Whitened target spectrum,  $\mathbf{s}$
    - Whitened pixel spectrum,  $\mathbf{x}$
    - $\mathbf{r} = \text{csc}(\theta)$
    - $\theta \rightarrow$  angle between  $\mathbf{s}$  &  $\mathbf{x}$
  - Generalized likelihood ratio statistic

