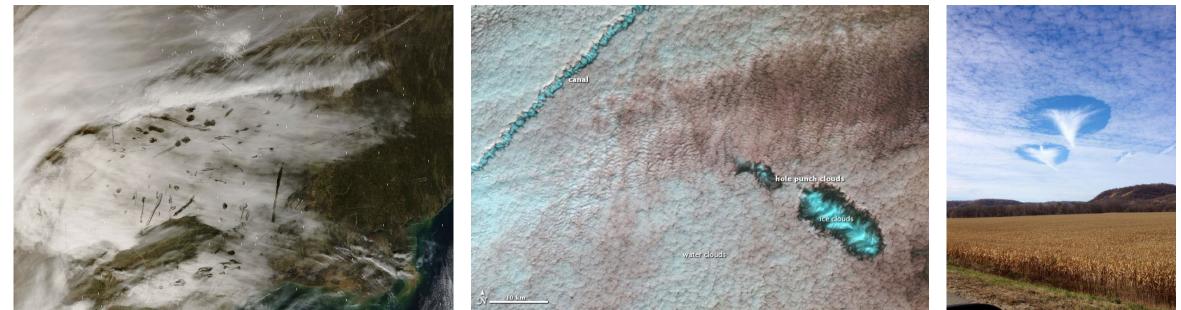


# Aviation-Relevant Satellite Research at CIRA

Steven D. Miller

Cooperative Institute for Research in the Atmosphere (CIRA) Clouds, Cloud Ceiling and Visibility (C&V) Technical Exchange Meeting UCAR/NCAR, Boulder CO

13 July 2022





### Topics

- 1. Brief CIRA Overview
- 2. Selected Satellite Applications bearing relevance to aviation
- 3. New technologies, techniques, and initiatives



## Cooperative Institute for Research in the Atmosphere (CIRA)



### **Competitively Established in 1980**

CIRA Serves as a Research and Development Arm of NOAA, Enabling High-Risk, High-Reward Atmospheric Science Applied Research Mission: Connecting NOAA to Colorado State University Researchers, Faculty, and Students, aligning NOAA research needs with long-standing academic strengths of the University.

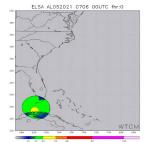
Vision: Realizing NOAA's societal benefit goals for a Weather and Climate Ready Nation via leadership in satellite remote sensing, forecast model and decision support, and model/observation connection.



Colorado State University RAMMB/Ft. Collins

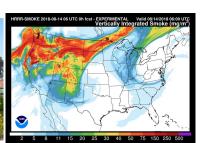












Note: Not in scale

AWC/Kansas City

-

Columbia Plateau

Great

San Diego

airba

pacific Ocean

CANADA

Pacific O c e a n Los Angeles

Chukchi Sea

RUSSIA



MN

IA

Des N

Gulf of

Mexico

C A N A

SD

NM

Honolulu

El Paso

MEXICO

Phoenix

Pacific Ocean

ND Bismarl

NEplatte

KS

Edwards Plateau

Oklahoma City

NHC/Miami



MDDE

Atla

THE BAHAMAS

CUBA

Осеа

country capital
 regional capital
 city/town

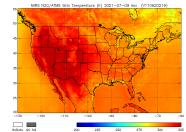
6.000 m 4.000 3.000 2.000 1.000

500 200

-100 m

#### NCWCP/College Park

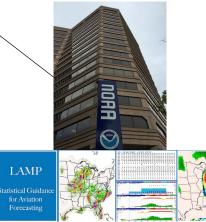




#### **Staffing By Location**

Location	Research	Admin	Total FTE
Boulder	40.2	1.1	41.3
College Park	9.0	0.2	9.2
Fort Collins	57.8	10.2	68.0
Kansas City	14.0	1.2	15.2
Miami	2.1	0	2.1
Silver Spring	11.0	0	11.0
Total	134.1	12.7	<mark>146.8</mark>
Fort Collins Kansas City Miami Silver Spring	14.0 2.1 11.0	1.2 0 0	15.2 2.2 11.0

MDL/Silver Spring



# CIRA Research Spans Multiple Themes

### **THEMES**

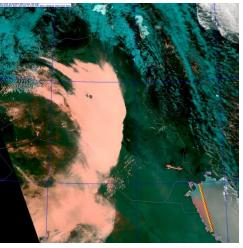
- 1. Satellite Algorithm Development, Training, and Education
- 2. Regional to Global Scale Modeling Systems
- 3. Data Assimilation
- 4. Climate-Weather Processes
- 5. Data Distribution

### **CORE CAPABILITIES**

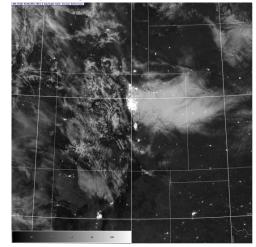
- Multi-satellite, multi-sensor, model-fusion
- Radiative transfer
- Machine Learning, Explainable AI
- Satellite Education, Training, and Outreach, R2O
- Forecaster tools, interfaces, model verification
- Societal and Economic Impact studies
- Connecting models and observations
- Faculty, grad student and postdoc involvement

#### Satellite Algorithms & Applications

#### **Dust Detection**



#### Day/Night Band: Snow



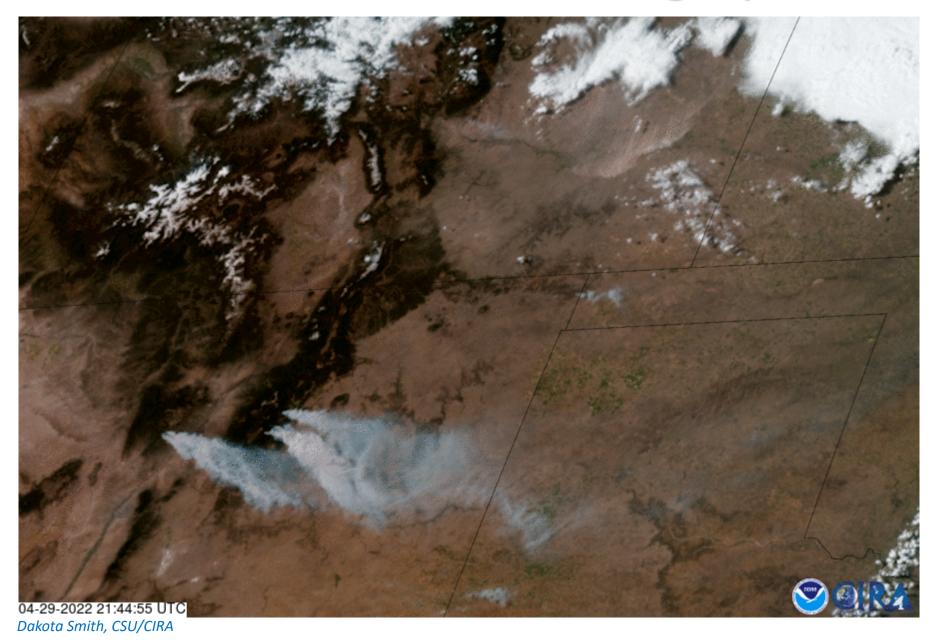
#### Connecting Products to Forecasters & Training



### **Advanced Satellite Imagery Applications**



### **CIRA's GeoColor Imagery**



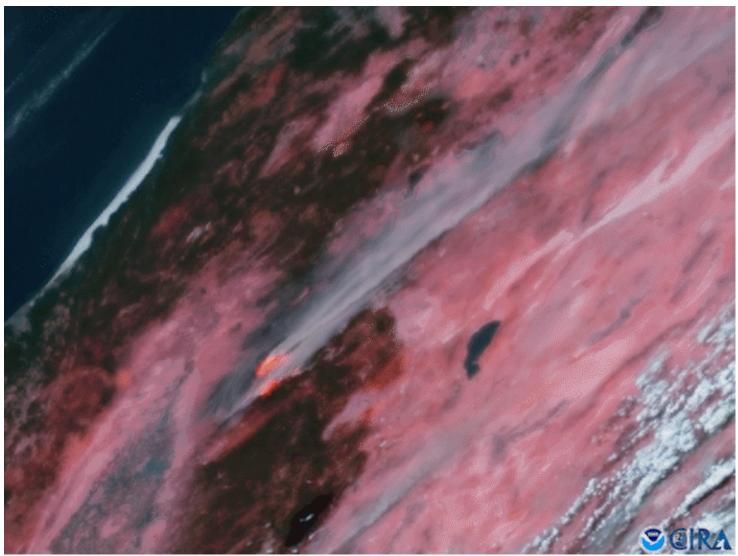
7



## **Blended High-Dimensional RGBs**

Curtis Seaman and Dakota Smith, CSU/CIRA

- GOES-16 ABI GeoColor imagery with Fire Temperature RGB (3.9, 2.25, 1.61) overlay
- Depicting the Dixie Fire (N. California) on 22 July 2021.
- Applications to pilot visibility

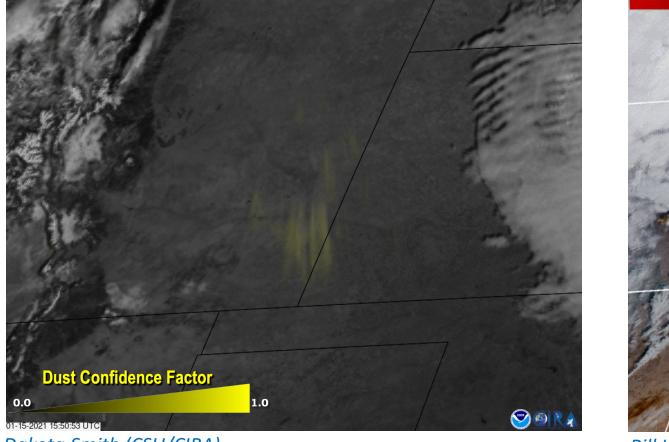




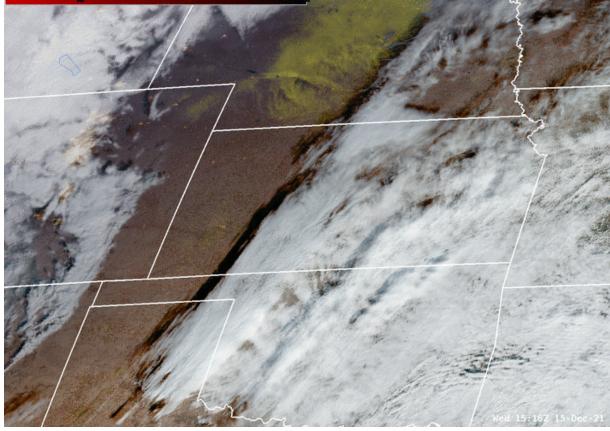
### **Multi-Spectral Lofted Dust Detection**

DEBRA Flow-Following (GOES-R ABI)





Dakota Smith (CSU/CIRA)



Bill Line (NOAA/NESDIS/STAR/RAMMB)

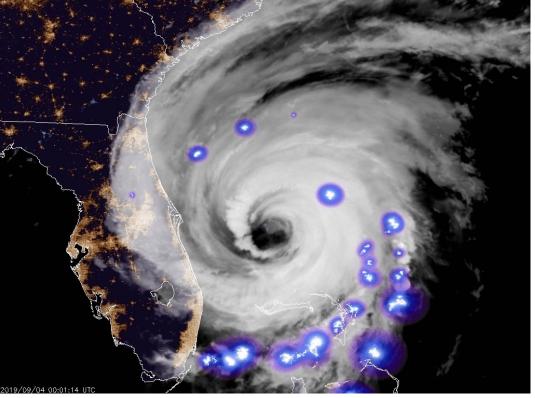
Additional applications to pilot visibility, particularly under VFR



### **Monitoring Natural Disasters Worldwide**

#### ABI/GeoColor + GLM: Hurricane Dorian 4 September 2019

Himawari-8/GeoColor: Hunga Volcano, Tonga 15 January 2022



YJ Noh, Kyle Hilburn, Dakota Smith, CSU/CIRA



Dakota Smith, CSU/CIRA

Monitoring aviation weather hazards at multiple space/time scales

### Visit SLIDER Web Page! https://rammb-slider.cira.colostate.edu

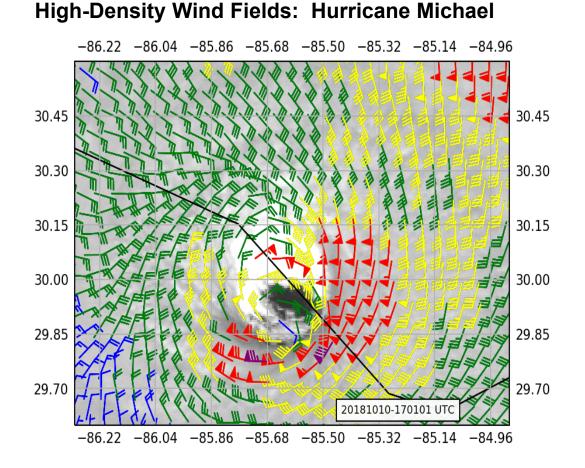
(Kevin Micke and Mattie Niznik, CSU/CIRA)

### **Quantitative Assessment of Cloud Dynamics**



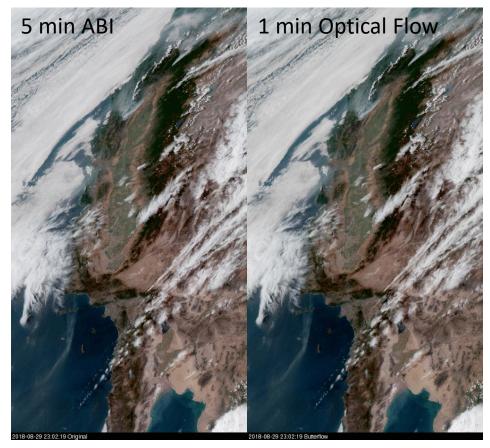
## **Optical Flow Motion Vectors & Imagery**

Jason Apke, CSU/CIRA



Pixel-resolved dense motion Can stratify by retrieved cloud height to infer flight-level winds

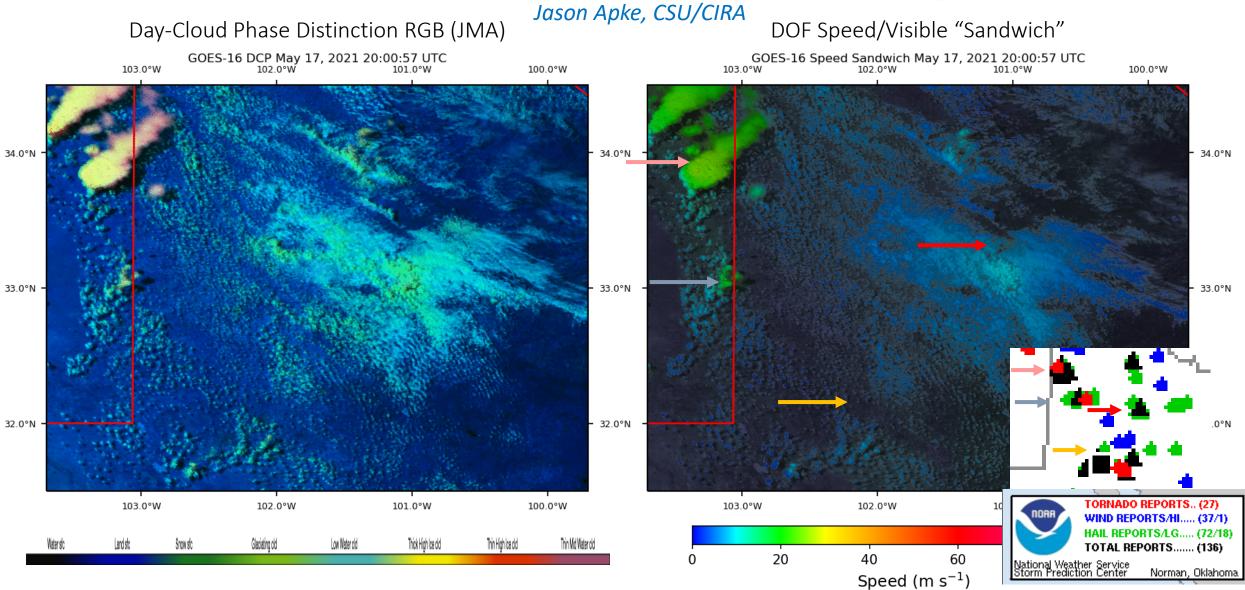
#### Time-Interpolated Imagery: GOES-East



Can be used to time-interpolate imagery in a way that is far superior to conventional "fades," filling imagery coverage gaps 12



### **Optical Flow Enhanced Imagery**

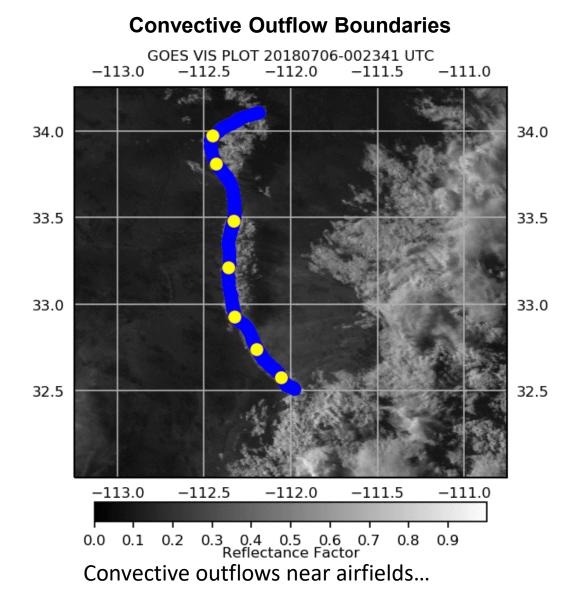


(*Left*) GOES-16 Day-Cloud Phase enhancement (from 0.64, 1.6, and 10.3 µm imagery) shown with (*Right*) Dense optical flow colored by wind speed with brightness indicating the 0.64 µm reflectance (the "OCTANE Speed Sandwich" product).

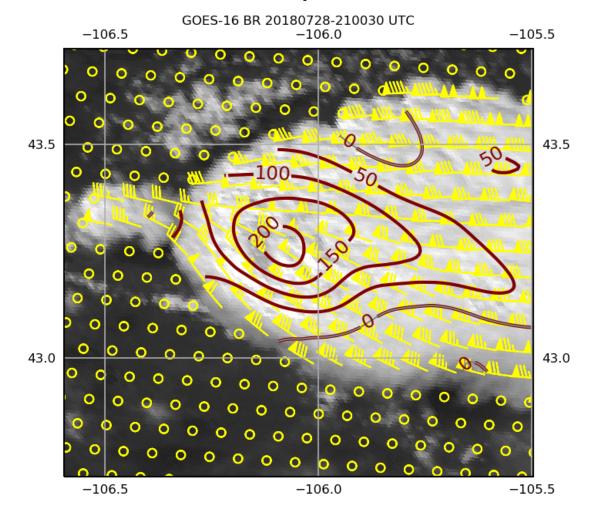


### **Optical Flow Dynamic Analyses**

Jason Apke, CSU/CIRA



#### **Storm-Top Structure**



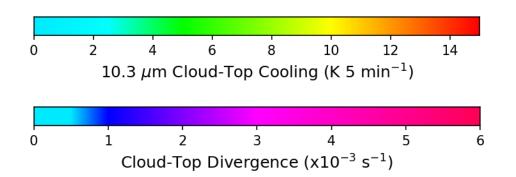
Clear air turbulence (gravity wave launching)... 14



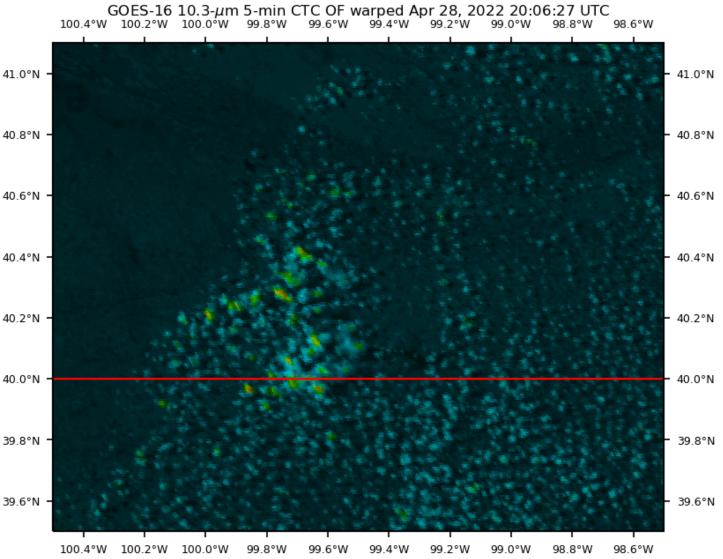
### **Optical Flow Blended-Product Imagery**

Jason Apke, CSU/CIRA

- Cloud-top cooling (CTC) products can serve as early indicators for convection before they can be spotted on aircraft radar.
- Optical flow "follows" the convections in space/time, allowing for high-quality CTC calculations that minimize shift artifacts



#### **Blended Cloud Top Dynamics**



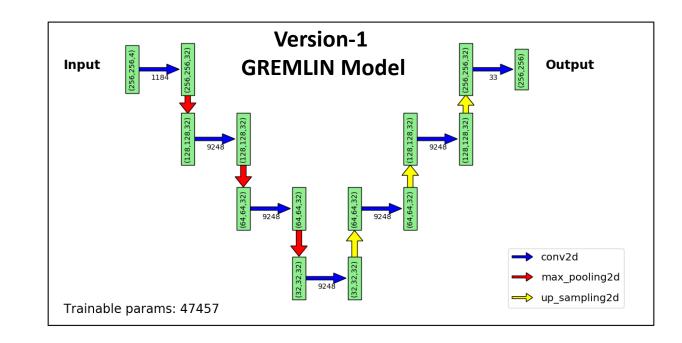
Pushing the Envelope of Remote Sensing Technology and Products

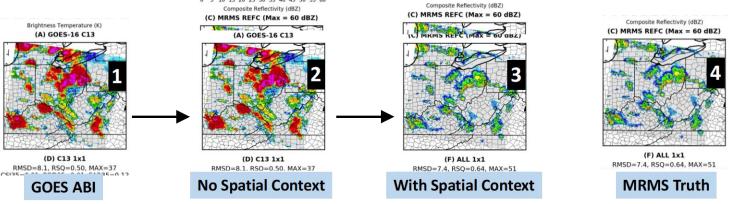


# Machine Learning Initiatives at CIRA

Kyle Hilburn, CSU/CIRA

- Harnessing the power of Machine Learning (ML), GOES-R capabilities to provide *"radar everywhere"* for initializing convection in high-resolution numerical weather prediction (NWP) models
- Introducing (GOES Radar Estimation via Machine Learning to Inform NWP) → GREMLIN
- Convolutional neural network
  - Captures information content in spatial patterns with convolutional layers (blue arrows)
  - Captures multi-scale information with pooling and upsampling (red, yellow arrows)
  - Leverages the power of spatial context provides a breakthrough improvement to skill!
- Image-to-image translation
  - Inputs: GOES ABI and GLM
  - Outputs: Multi-Radar/Multi-Sensor (MRMS) composite reflectivity



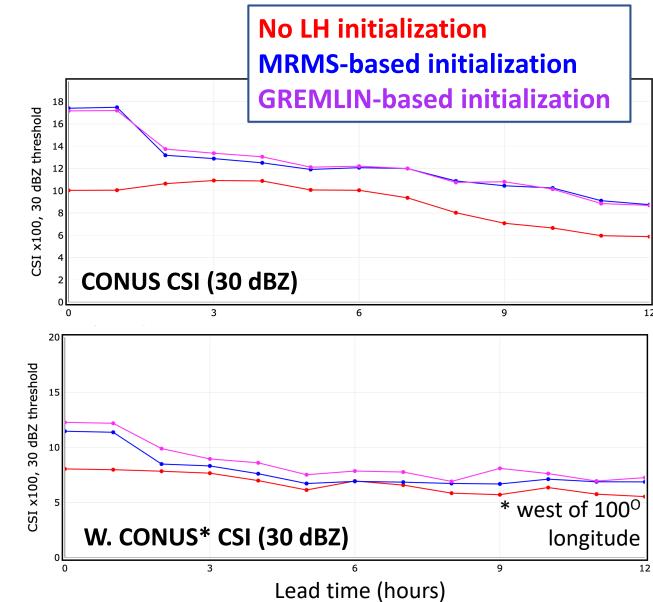




# Machine Learning Initiatives at CIRA

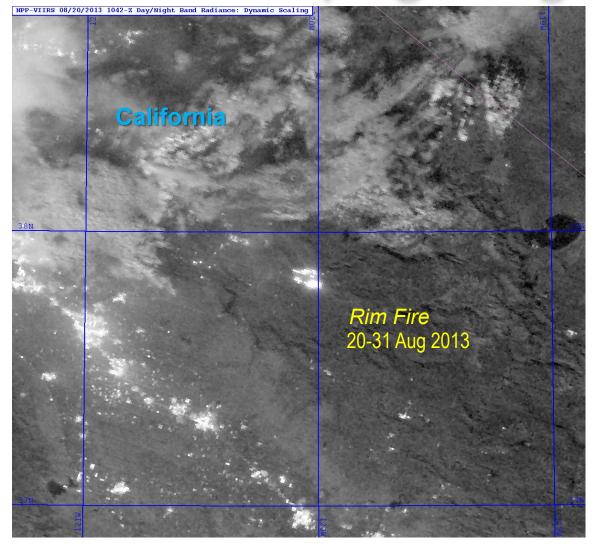
Kyle Hilburn, CSU/CIRA

- A 1-week experimental period was conducted, GREMLIN-assimilated data to assess NWP skill impact...
- Critical Success Index (CSI, higher = better)
  vs. forecast lead time assessed →
- Initializing the RRFS with GREMLIN outperformed MRMS over the the entire CONUS domain, and the Western U.S. where radar coverage is limited!
- Aviation: "Deterministic Convective Initiation" (when and where the nascent convection is observed) is key to predicting convective outflow structures/interactions near airfields!





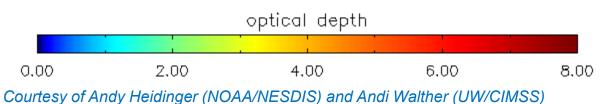
### Helping to Fight Fires at Night?



→ Smaller fires and smoke detection can complement infrared observations

clavrx\_npp\_d20171206\_t1028508\_e1030149\_b31653.level2.hdf

Lunar Reflectance Model Enables Optical Properties (*Preliminary Results*)



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### On the Horizon: "OVERCAST" Initiative

- Sponsored by the Office of Naval Research (ONR)
- Generate quantitative global, near real-time threedimensional (3D) satellite cloud analysis based on:
  - Cloud Geometric Thickness estimation
  - Hidden layer estimation
  - Ice/Water profile estimation
  - Potentially expand to other cloud/environmental fields
- Global cloud analysis rendered via:
  - Geostationary + polar-orbiting satellite sensors (ABI, AHI, SEVIRI, VIIRS, AVHRR), blended at seams
  - Rooted in NOAA Enterprise processing (CLAVR-x)
- These products can be leveraged by the FAA and other users for near real-time flight planning (YJ Noh's talk)
- Project kicks-off this summer!







### Extra Toppings



### **Multi-Spectral Lofted Dust Detection**

