



# NEW SCHEME TO IMPROVE THE DETECTION OF RAINY CLOUDS IN PUERTO RICO

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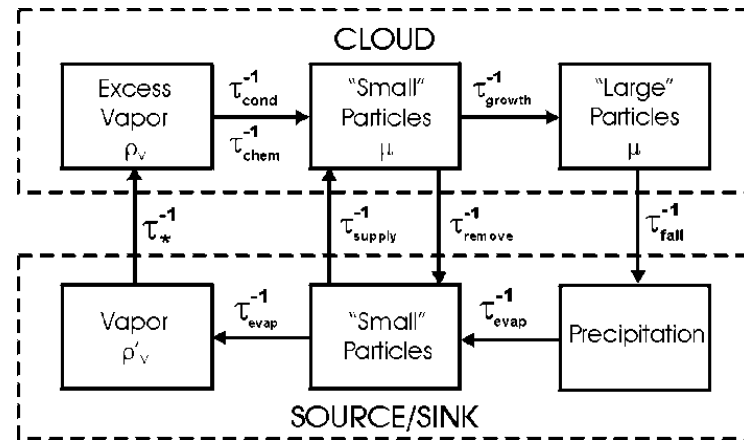
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# Introduction

- A cloud rainfall event is the result of a complex thermodynamic process that starts with nucleation of cloud drops, continues with drop growth, and finishes with water drop precipitation.

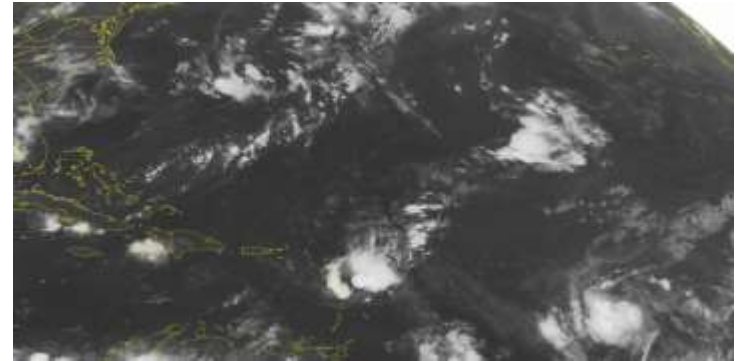


The Hydrologic Cycle: Thermodynamic processes which govern cloud microphysics. Source: National Weather Service (2010)



# Rainfall Cloud Identification

- **Caribbean Rainfall:**
  - **Tropical Systems** (waves, storms, and hurricanes) summer and autumn season
  - **Cold Fronts**: winter and spring season
  - **Troughs** during all year
  - **Orographic Effects** (water vapor, mountains and winds integrations)



GOES Images at Water Vapor Band (10.7 um)



GOES Images at Infrared Band (3.9 um)



# Research Tasks

- Generate a couple algorithms for predict rainfall spatial distribution for Puerto Rico and Caribbean Basin.
- The proposed model consider temporal and spatial analysis based on a sequence of rainfall rate. For instance, images generated from **Self-Calibrating Multivariate Precipitation Retrieval (SCaMPR)** algorithm.
- Produce a couple algorithms for **identifying potential raining clouds cells** and forecast **short-term rainfall accumulation**.



# STRaP

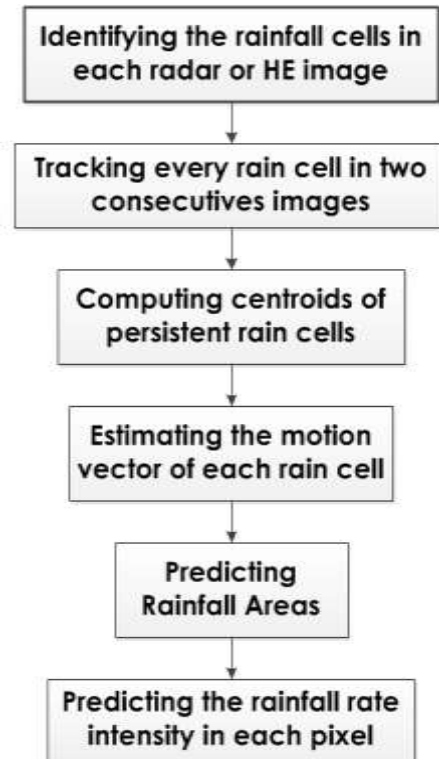
- The **Short Term Rainfall Prediction Algorithm** includes temporal and spatial components to detect where rain occurs, and forecast the evolution of rainy clouds during short intervals (***Generation, Intensification and Dissipation***).
- The main goal is to improve the rainfall detection of **SCaMPR**, which is the operational rainfall rate algorithm of **GOES-R**.



# STRaP Methodology

The proposed algorithm is divided in two main components:

1. **Determine rainy cloud pixels (Tracking Raining Cells)**
2. **Rainfall estimation (Rainfall Prediction Model)**
  - A **tracking rainfall cells method** is introduced to forecast the cloud displacement based on a **Pattern Recognition Scheme** and **Cloud Motion Vector**.
  - A **Rainfall Prediction Models** are introduced to forecast **short term precipitation**, based on **linear and non linear regression equations**.





# Preliminary Results

- Skill Score validation is applied to compare convective cloud pixel detection generate by **STRaP's**.
- Errors and Bias analysis is used to estimate intensity and accumulate rainfall.
- Eight rain events was selected occurred in Puerto Rico since 2008 and 2014.

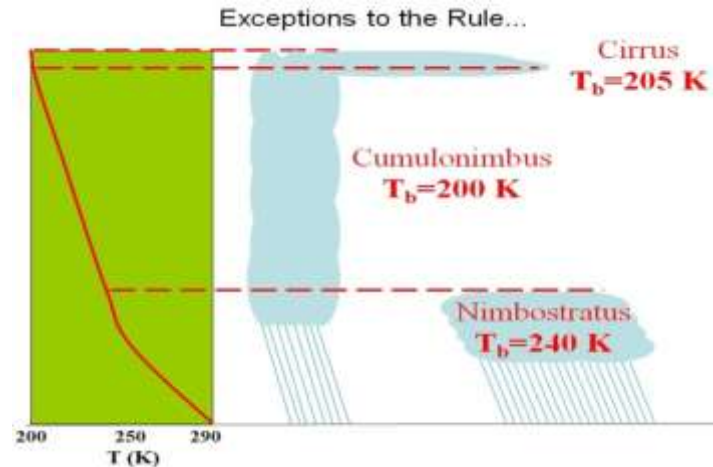


# Rainfall Events

- September 29, 2008 (Warm Clouds)
- June 24, 2010 (Cold Clouds)
- July 14, 2011 (Cold Clouds)
- October 18, 2011 (Warm Clouds)
- October 22, 2012 (Warm Clouds)
- December 1, 2012 (Warm Clouds)
- July 18, 2013 (Cold Clouds)
- August 19, 2014 (Cold Clouds)

Warmer Clouds: Horizontal Convection  
Lower vapor elevation and higher top cloud temperature. (BT Band 4 > 235 K)

**Colder Clouds:** Vertical Convection  
Highest Vapor elevation and lower top cloud temperature. BT Band 4 < 235 K



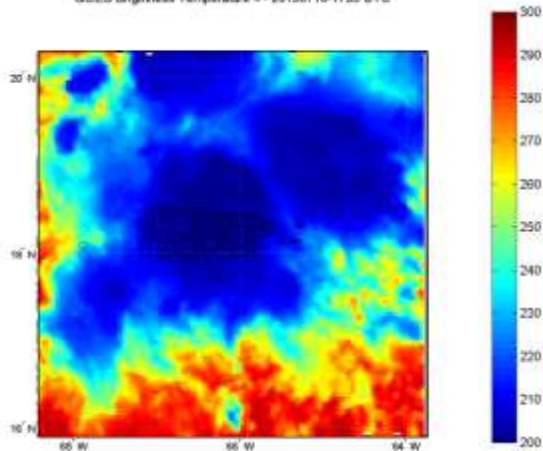




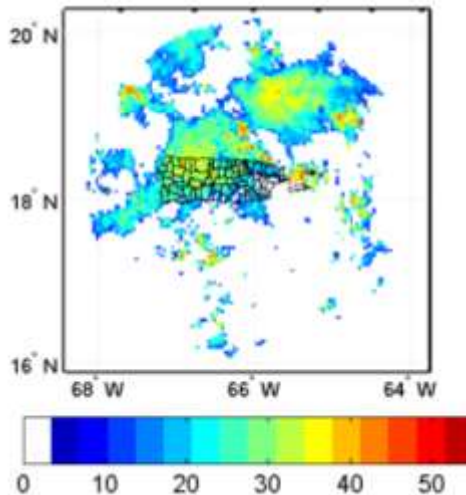
# Preliminary Results: Cold Clouds

Over  
detection

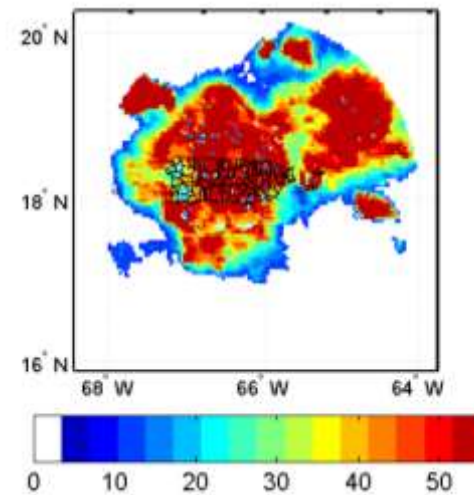
GOES Brightness Temperature 4 - 20130718-1735 UTC



**GOES**



**NEXRAD**



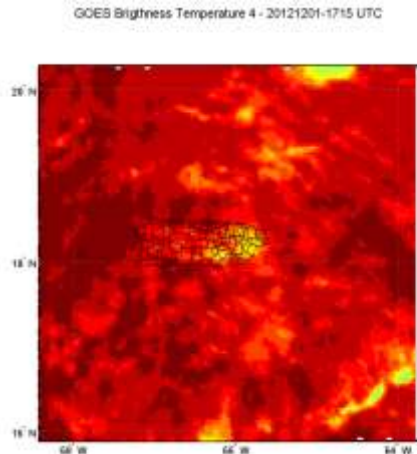
**SCaMPR/  
STRaP**

**Band 4 GOES-13, NEXRAD, SCaMPR and 30 minutes forecast (STRaP).  
Rainfall event in Puerto Rico, during July 18, 2013 at 1730 UTC.**

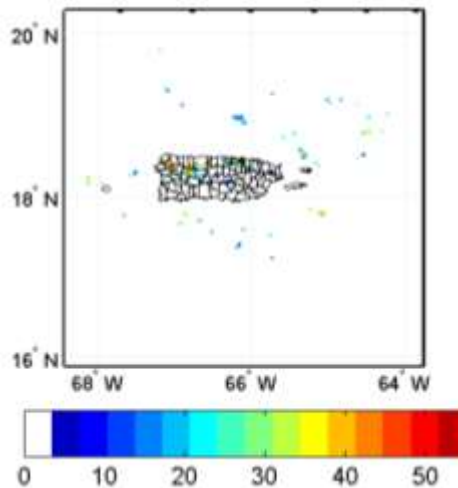


# Preliminary Results: Warm Clouds

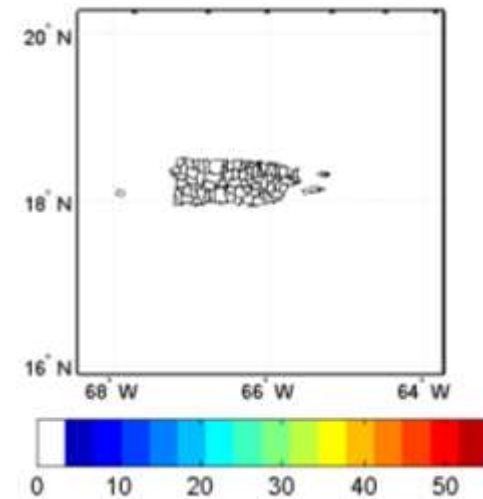
No Rainy  
Detection



GOES



NEXRAD



SCaMPR/  
STRaP

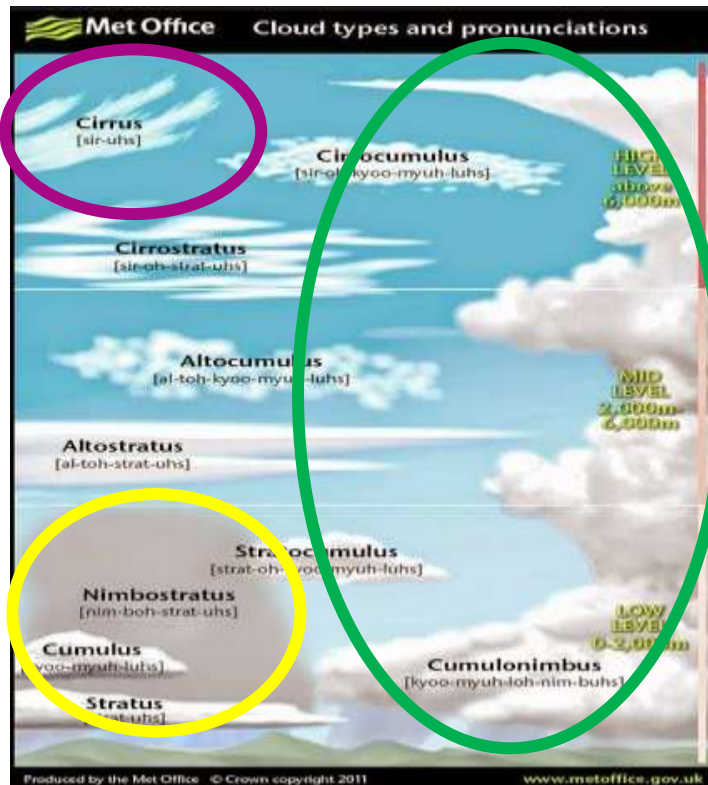
Band 4 GOES-13, NEXRAD, SCaMPR and 30 minutes forecast (STRaP).  
Rainfall event in Puerto Rico, during December 1, 2012 at 1715 UTC.



# Rainy Cloud Detection Problems

**Cirrus** are cold clouds but don't generate rainfall. Low Temperature changes across vertical profile. Stable conditions in troposphere affected rainfall potential activity.

**Nimbostratus** are warm clouds with relative rainfall activity. Temperature is warmer than 235 K. Temperature changes across vertical profile. Unstable conditions in troposphere affected rainfall potential activity.



**Cumulonimbus** are cold clouds with strong rainfall activity. High temperature changes across vertical profile shows unstable conditions in troposphere that affected rainfall potential activity.

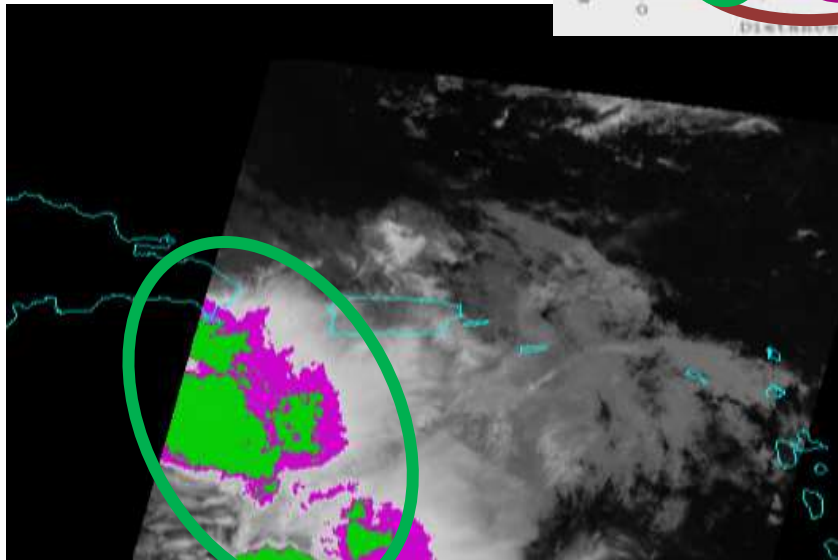


# Results: Rainy Detection based on MODIS and NEXRAD August 28, 2015 at 1505 UTC

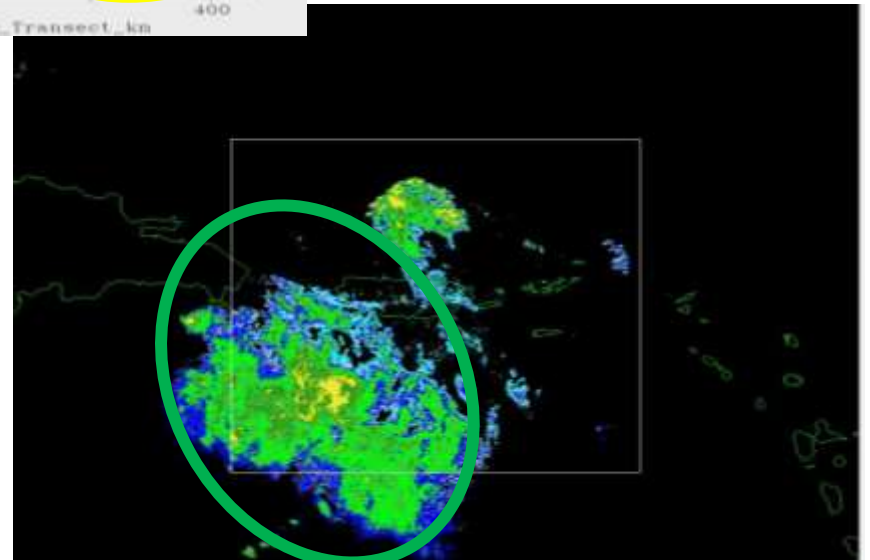
Cold Clouds  
Zone  
BT < 235 K



No Clouds Zone  
BT > 280 K



Convective Cloud Detection based on MODIS Infrared Bands (11 and 14.2 um)

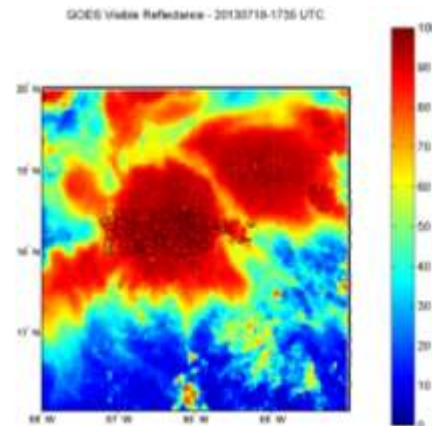
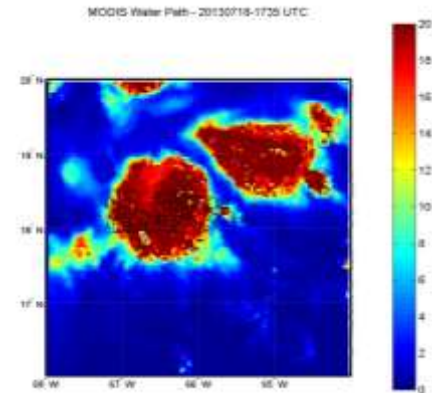


Convective Cloud Detection based on NEXRAD Reflectivity Level 2 at 0.5 degrees.



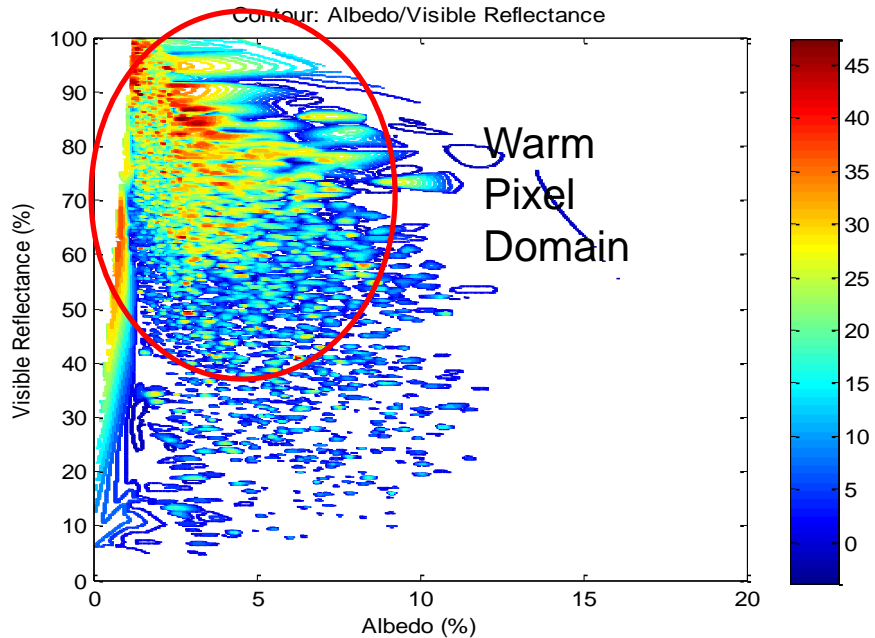
# Potential Rainfall Indicators

- Cloud Product combines infrared and visible techniques to determine physical and radiative cloud properties.
- **MODIS: Microwave Bands(1.6, 2.1, 3.7 um) – Active Sensor – Orbital**
  - Liquid Water Path ( $\text{g}/\text{m}^2$ )
  - Optical Thickness (Cloud depth)
  - Effective Radius (Dropsize Distribution -  $\mu\text{m}$ )
- **GOES: Visible and IR Bands (0.65, 3.9, 6.7, 10.7 um) – Passive Sensor – Geostationary**
  - Visible Reflectance (Visible Band)
  - Effective Radius: (IR Bands 2 and 4)
  - Albedo (Bands 2)
  - Bands Ratio (Bands 2,3 and 6)
  - Band Differences (Bands 2,3 and 6)

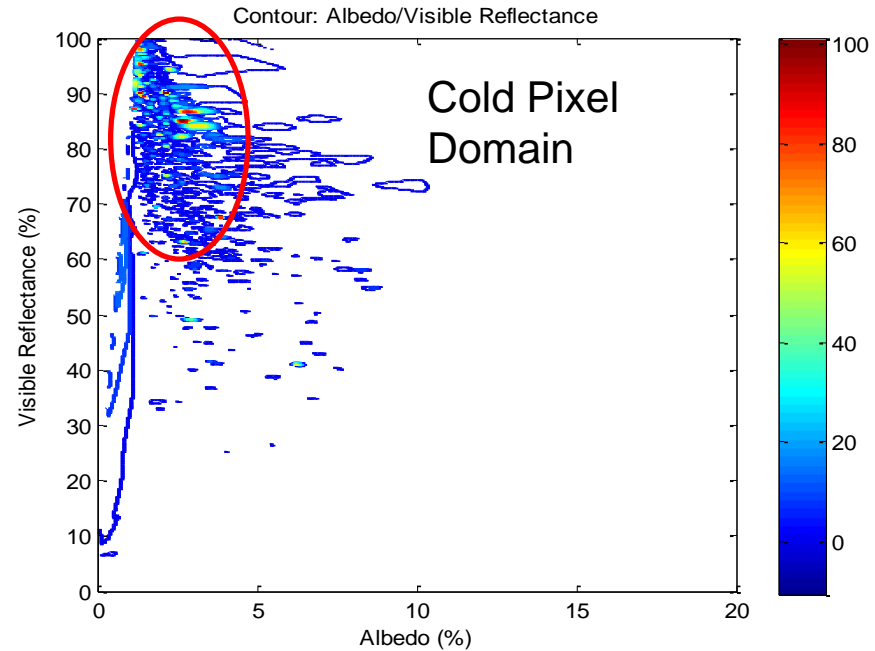




# Cold and Warm Clouds: Rainy Contour Analysis



Warm Raining Clouds



Cold Raining Clouds



## Optimal Rainy Pixel Detection algorithm (ORPD)

- **Input Variables:** The subroutine selects the potential rainy pixels (**PRP**) based on Albedo and Visible Reflectance.

$$AL < Al_{\max} \text{ and } VR > VR_{\min}$$

- **Binary Output**

PRP = 1; This is a potential rainy pixel  
otherwise

PRP = 0; This is a non potential rainy pixel



# ORPD Goal Criteria

- Maximize pixel **Hit Rate (HR)**, and **Probability of Detection (POD)** of rainy pixels.
- Minimize rainy pixel **False Alarm Rate (FAR)**
- Obtain the best **Heidke Skill Score (HSS)** for detected rainy pixels.



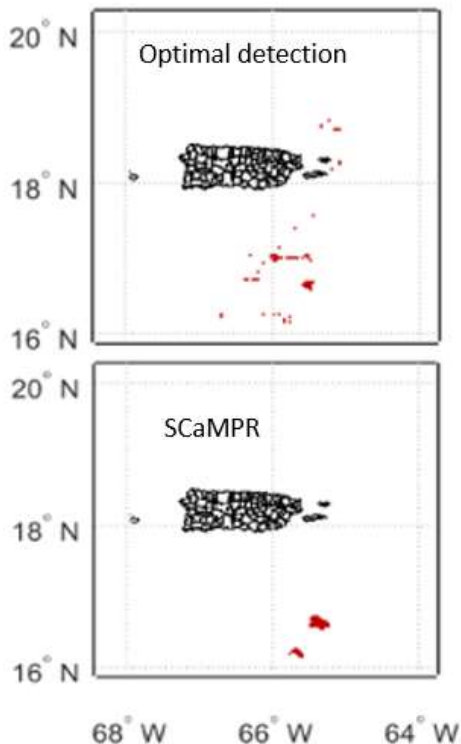
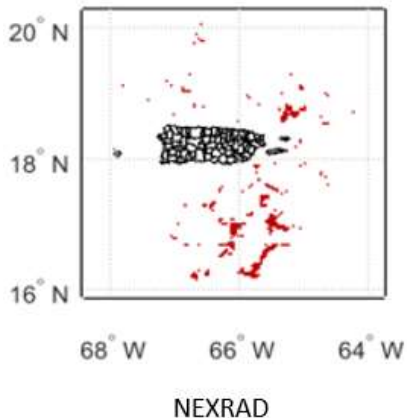


# True Table: Rainy Events

Parameters	SCaMPR	Rainy Cloud Detection Algorithm
Hit Rate (HR)	0.93	<b>0.96</b>
Probability of Detection (POD)	<b>0.59</b>	0.50
False Alarm Rate (FAR)	0.71	<b>0.55</b>
Bias (B)	2.02	<b>1.11</b>
Heidke Skill Score	0.36	<b>0.47</b>

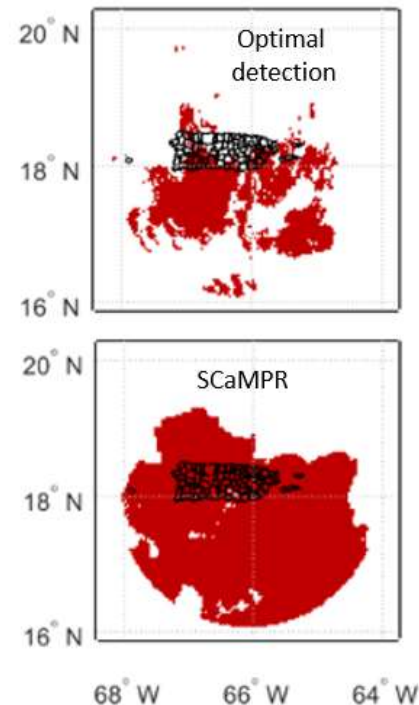
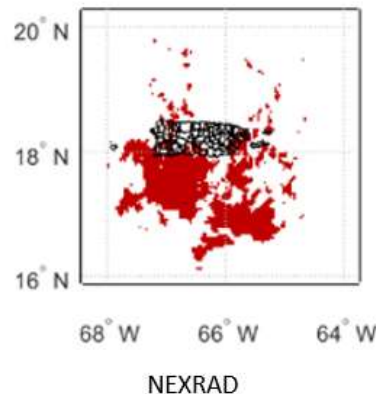
# Rainy Detection based on ORPD

**December 1, 2012  
at 1215**



Pixel detection spatial distribution during a warm rainy cloud underestimation

**July 18, 2013  
at 2015**



overestimation

Pixel detection spatial distribution during a cold rainy cloud



# Final Thoughts

- One of the main purposes of this work is to improve the detection of warm raining clouds from **SCaMPR**, using Puerto Rico as a testbed.
- Data from several sensors and in different spectral ranges are studied. Specifically this work had been focus on study data from **MODIS**, **GOES** and **NEXRAD**.
- Generate new empirical equations to detect potencial rainy pixels based on **GOES Products**.
- Improve warm clouds detection for **SCaMPR**, using Albedo and Visible Reflectance.



# Acknowledgements

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