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# Synthesizing Cloud Field Complexity over Ascension Island and Beyond

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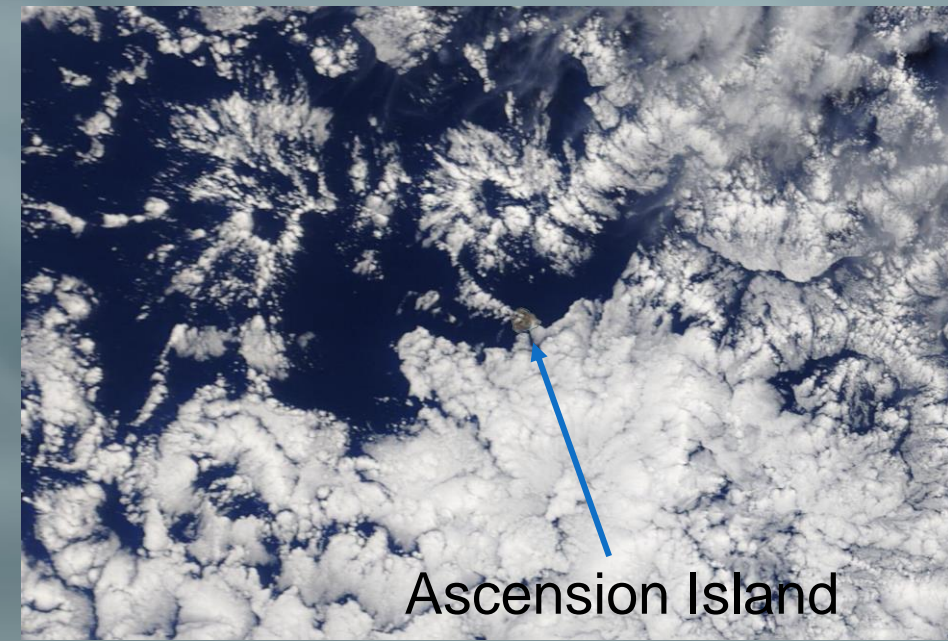
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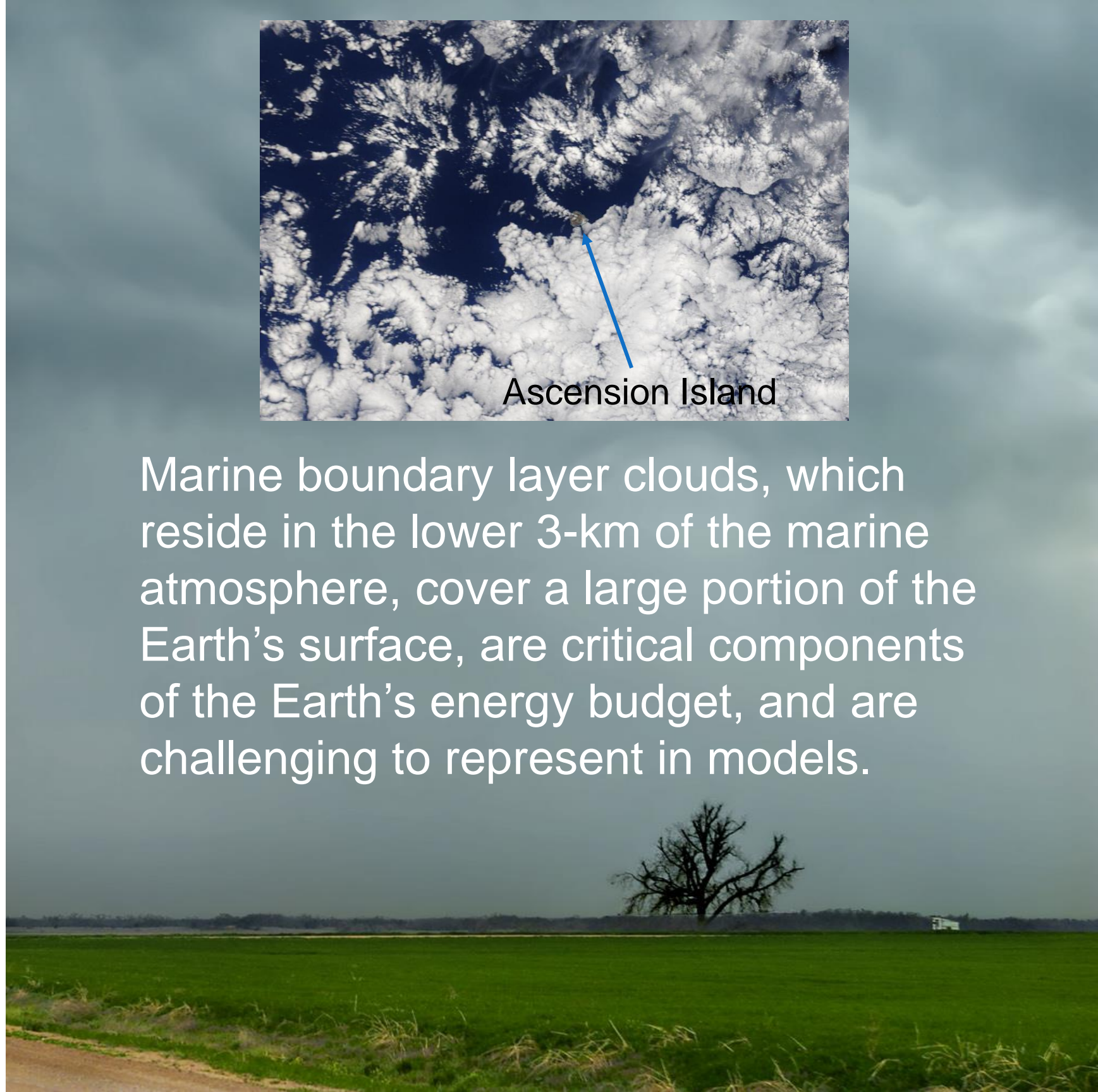
**Mark A. Miller and Qiuxuan Zheng**  
Rutgers University

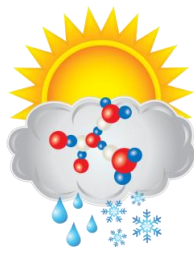
**Allison Collow**  
Universities Space Research Association



Ascension Island

Marine boundary layer clouds, which reside in the lower 3-km of the marine atmosphere, cover a large portion of the Earth's surface, are critical components of the Earth's energy budget, and are challenging to represent in models.





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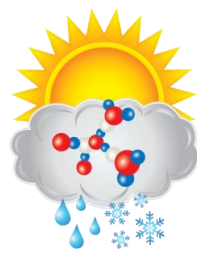
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- Marine Boundary Layer (MBL) clouds
  - structurally complex consisting of mixtures of different cloud types that often produce light precipitation
  - cloud morphology at a given time and place depends upon large-scale meteorological conditions and cloud-to-cloud interactions
  - Marine cloud structure is highly variable and often changes every few hours.
- We are experimenting with machine learning techniques to efficiently categorize and quantify the complexity of these cloud fields.
- Detailed measurements of MBL clouds have become recently available from the ARM program at locations such as Ascension Island (ASI), which is in the South-Central Atlantic Ocean.
- Remote sensors at ASI provide structural measurements of the overlying clouds every two seconds and radiosondes (balloon-borne sensors) measure the profiles of temperature, humidity, and pressure several times per day.





# ASR Goals and Objectives

Atmospheric  
System Research

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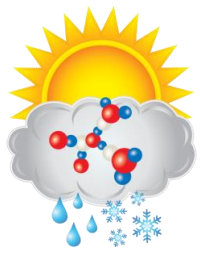
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- Quantify the MBL cloud morphology in 6-hour increments using data collected from Ascension Island (ASI) during the Layered Atlantic Smoke Interactions with Clouds (LASIC)
  - Use machine learning to classify cloud morphology
- **Identify specific features of the clouds at ASI that may be associated with the steep island coastline**
- Contrast the cloud morphology over the South Central Atlantic with that observed over Eastern North Atlantic (ENA).
- Continue to develop methods to classify MBL cloud structure at all ARM marine deployment locations





# Quantifying Complex Cloud Morphology

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- We are applying a machine learning algorithm known as K-Means to ASI cloud measurements

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- K-Means is a method of quantization that aims to partition a collection of observations into “clusters” in which each observation belongs to the cluster with the nearest mean.
- Each 6-hour period of cloud observations from ASI and ENA are assigned to a cluster that indicates different cloud morphology
- Three inputs describing the physical attributes of the cloud field are used as inputs to the K-Means algorithm:

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✓ A Thickness Index (TI) :  $TI = \frac{1}{N} \sum_{j=1}^N \left[ \left( \sum_{i=i_b}^{i_t} k_i \cdot \Delta Z \right) / z_{max} \right]_j$   $\begin{cases} k_i = 1 & Z > -35 \text{ dBZ} \\ k_i = 0 & Z < -35 \text{ dBZ} \end{cases}$

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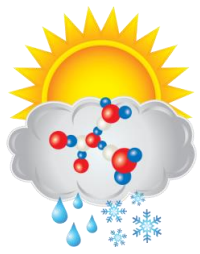
✓ A Drizzle Index (DI) :  $DI = \frac{1}{N} \sum_{j=1}^N \left[ 10 \left( (\bar{Z}_{\Delta h_{DD}} + 35) / 45 \text{ dBZ} \right) (\Delta h_{DD}(m) / z_{max}) \right]_j$

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✓ A Complexity Index (CI) :  $CI = \frac{h_{c\_max}(m) - h_{c\_min}(m)}{z_{max}}$

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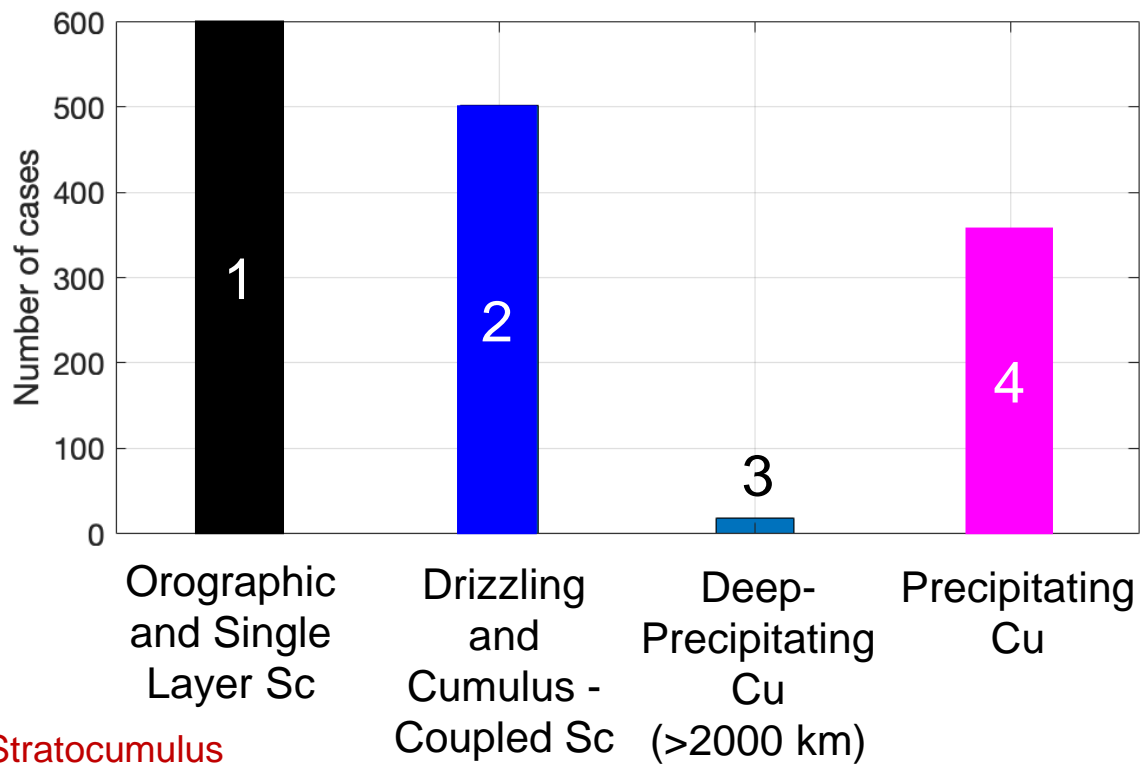
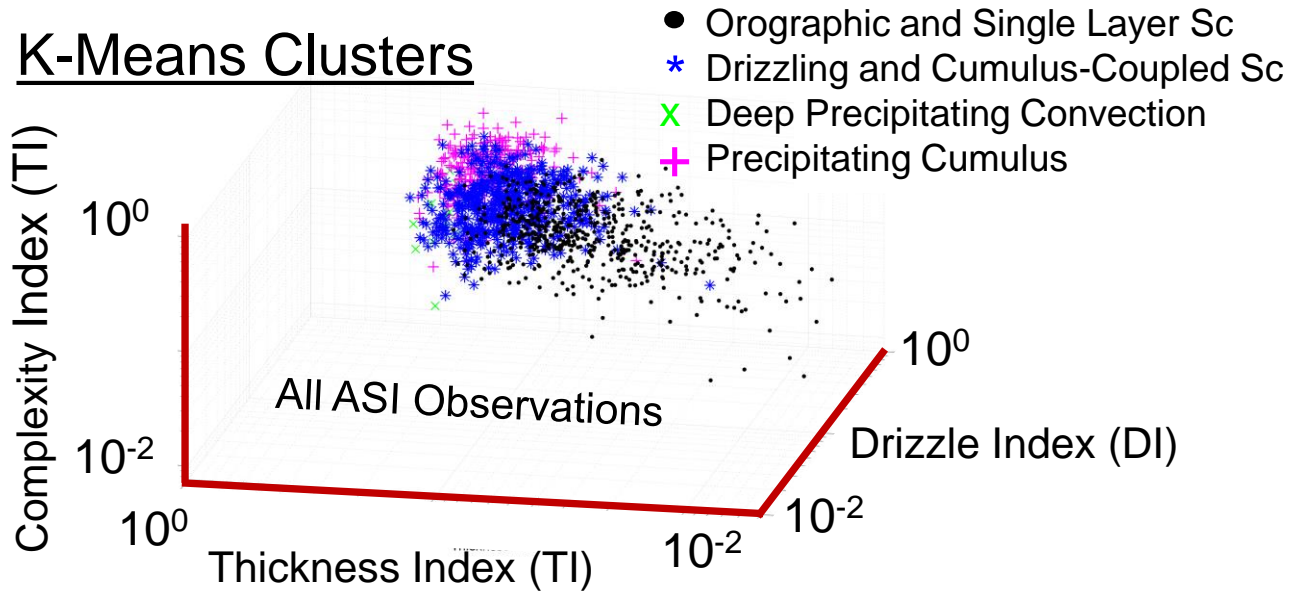
- These indices represent measures of the total cloud depth, rainfall intensity, and geometric variations in the cloud field.



# Classifications for Ascension Island

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## K-Means Clusters



Sc: Stratocumulus  
Cu: Cumulus

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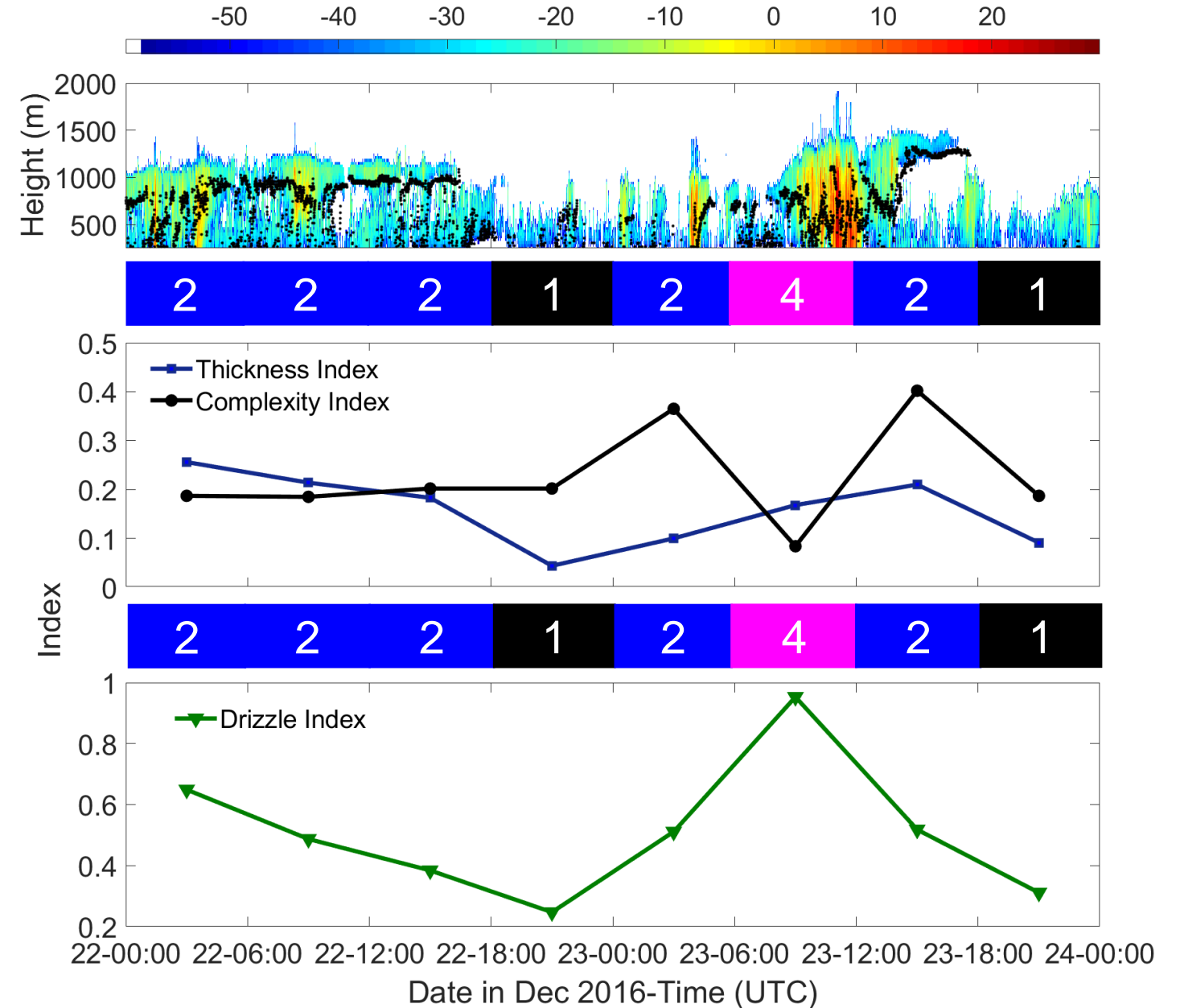
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## Classification Example: Dec. 22-23, 2016





**ARM**

# Summary



- One year of ASI cloud measurement were subjected to a K-Means clustering algorithm based upon three indices that quantify different aspects of the cloud morphology, which was originally applied to data from the ARM Eastern North Atlantic (ENA) Observatory.
- Cloud morphology at ASI includes a combination of marine boundary layer and orographic clouds and K-Means showing success in differentiating.
- ASI/ENA cloud morphology is similar in most classifications

Site	Single Layer and Orographic* (%)	Drizzling and Cu-Coupled Sc (%)	Deep Convection (%)	Precipitating Cu (%)
ASI (1 year)	41*	34	1	24
ENA (4 summers)	47*	25	5	23

\* Orographic clouds primarily at ASI, single layer Sc primarily at ENA

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