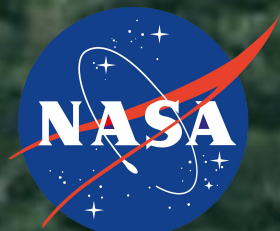


# Early Warning System using a multi-sensor Disturbance Index

Sean Healey, Eric Bullock, Zhiqiang Yang, Carole Andrianirina, Rasmus Houborg, Sylvia Wilson



**Partner: Laboratoire d'Observation des Forêts de Madagascar (LOFM),  
Bureau National des Changements Climatiques et de la REDD+  
(BNCCREDD+), Ministère de l'Environnement et du Développement  
Durable (MEDD)**



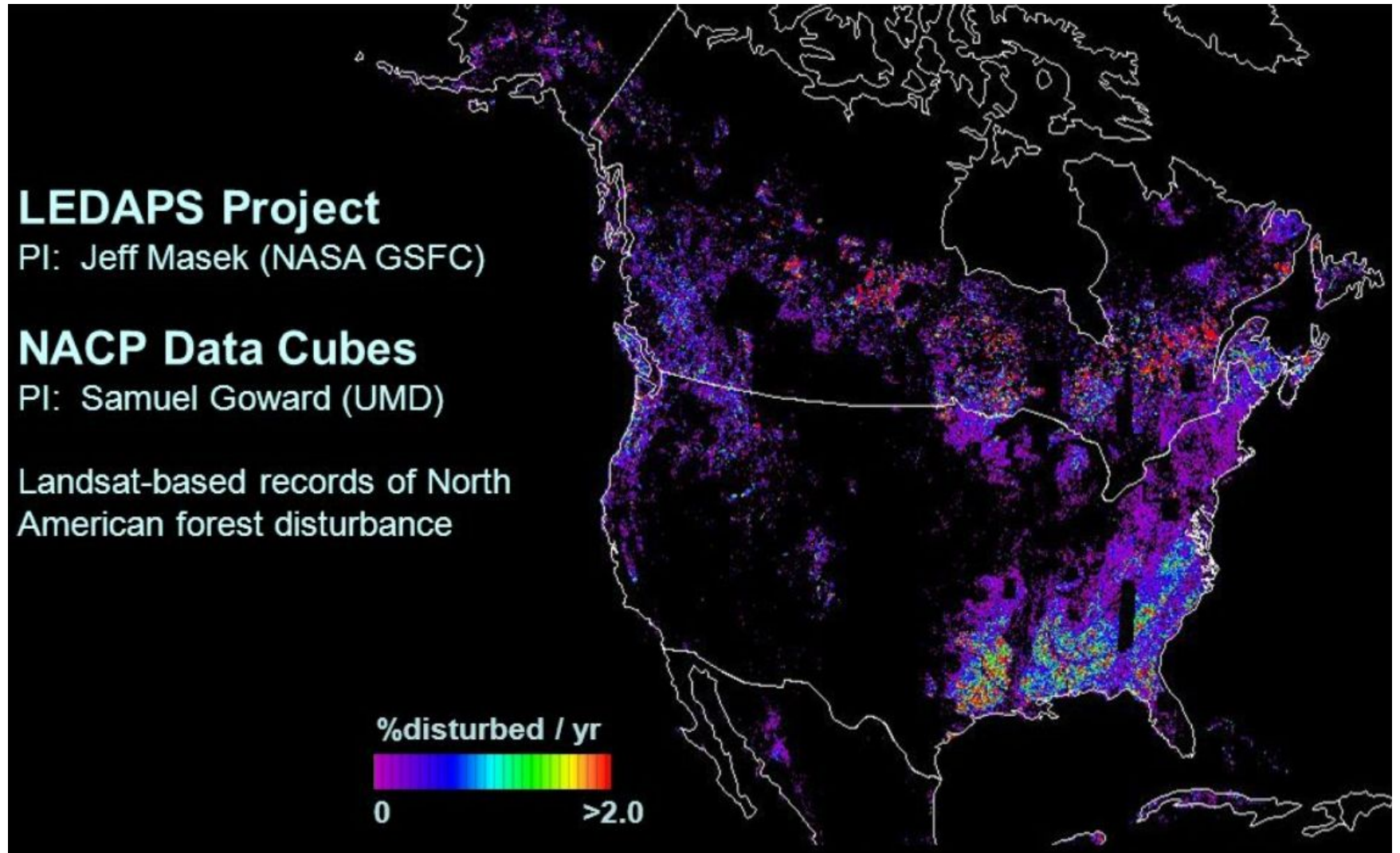
A photograph of a dirt road in a rural, hilly area. The road is made of reddish-brown soil and has a large, deep erosion gully running down its center. The surrounding landscape is covered in green vegetation, including trees and bushes. The sky is overcast with grey clouds.

## Alerting Systems must be:

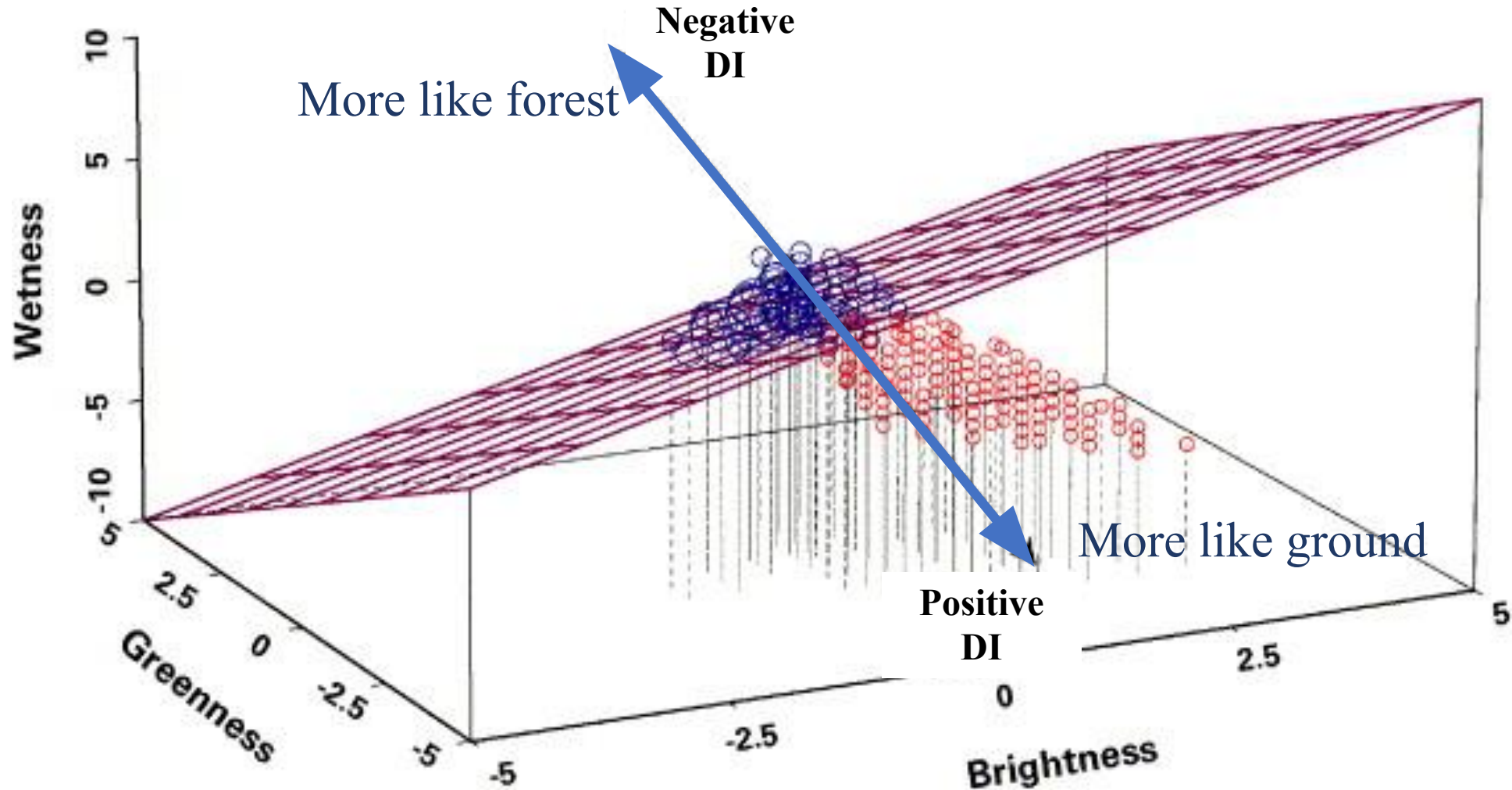
- Accurate (particularly with low false positive error)
- Timely
- Intuitive
- Automated
- Low-bandwidth, low-hardware

Landsat Disturbance Index ( $DI_L$ ) – simple and effective transformation of Landsat data that highlights forest loss over time

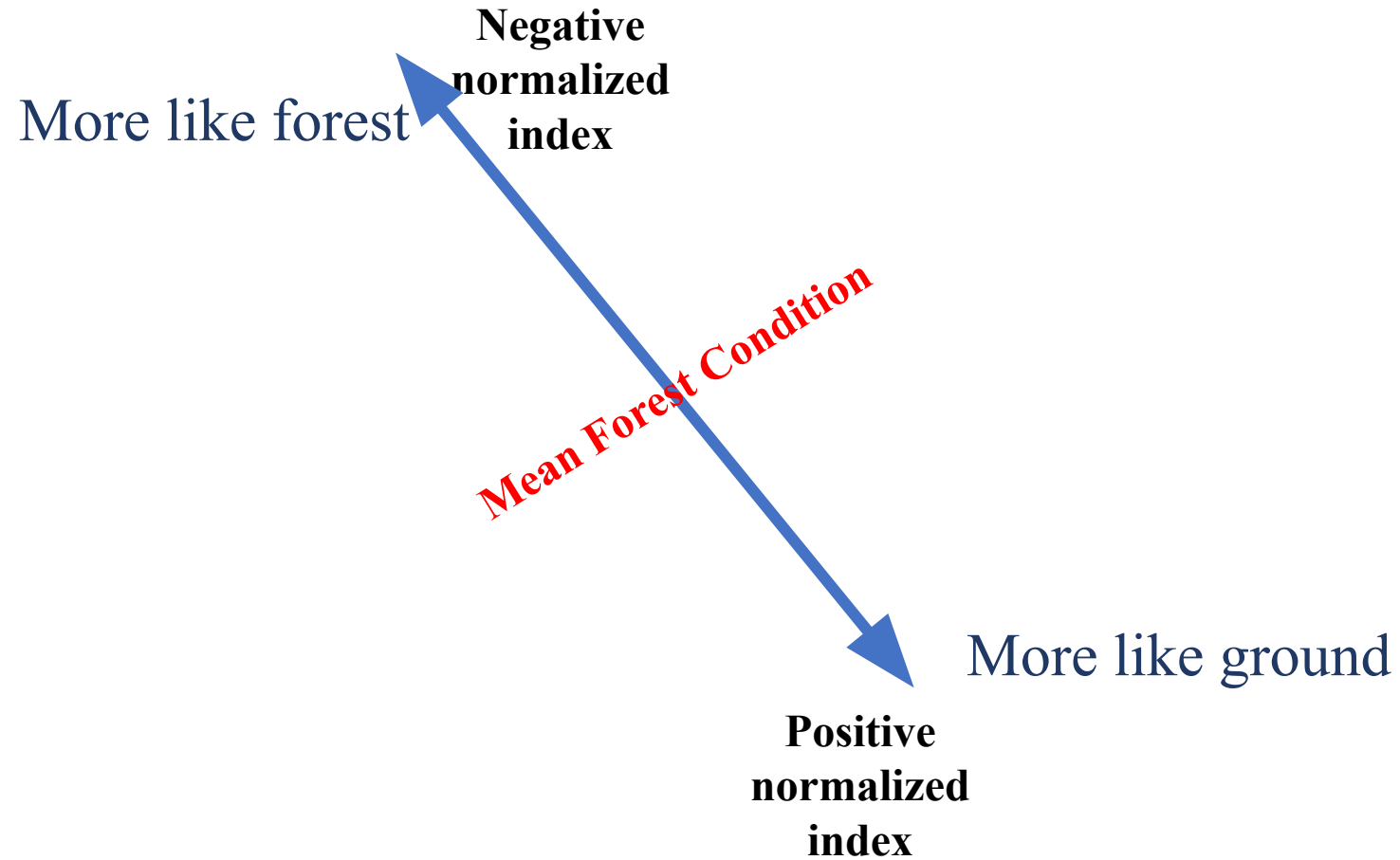
*30 meter  
mapping of forest  
loss with 2004  
technology*

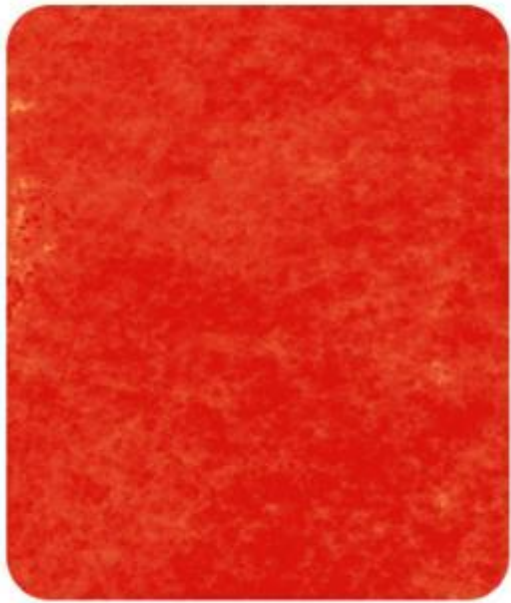


The Disturbance Index compares the reflectance of each pixel to the average condition of nearby forests, expressing it in standard deviations above (toward ground) or below (toward really dark forest) the mean

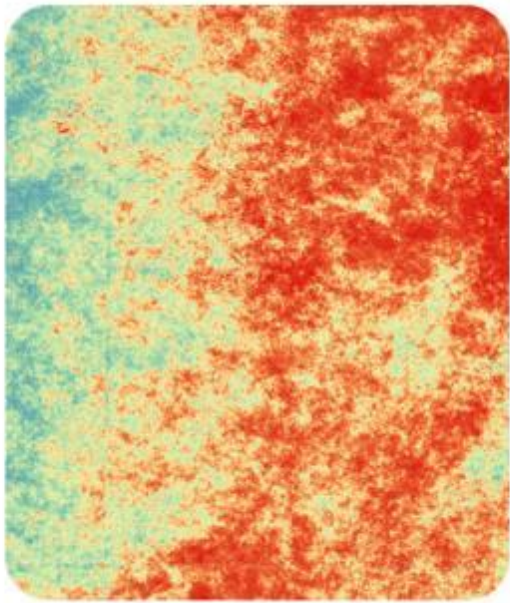


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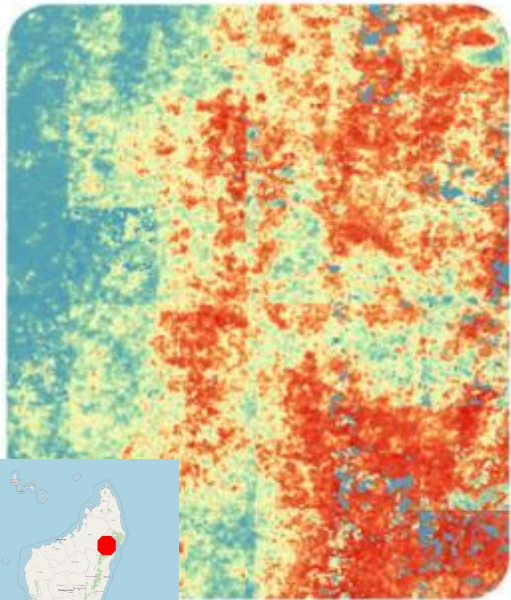




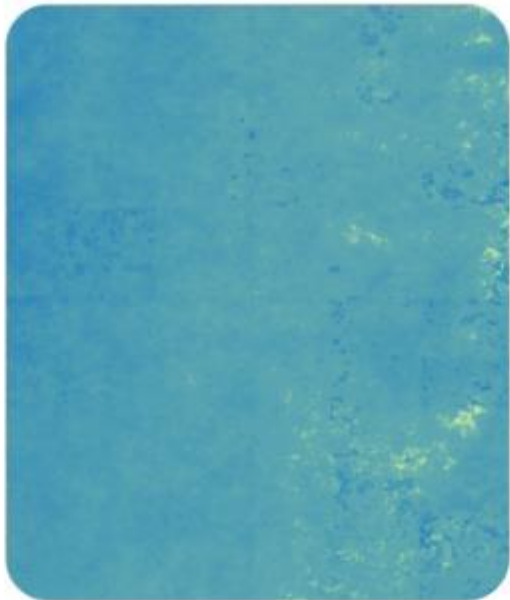
Landsat



Sentinel 2



Planet

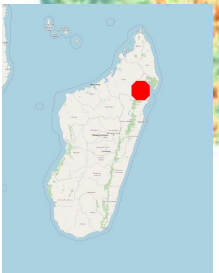


Landsat + Sentinel 2 + Planet

Clear observations

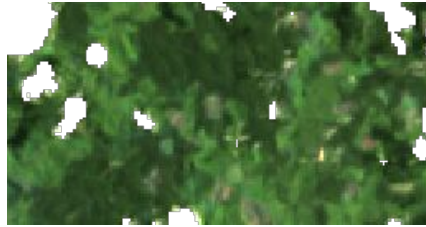


Motivation for using multiple sensors in one of the world's cloudiest places



# Multi-Sensor Disturbance Index

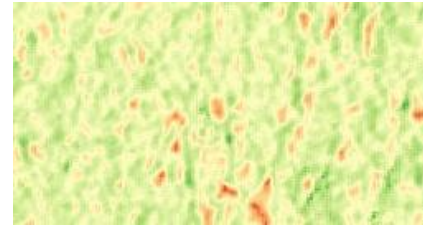
Landsat (3/1/2020)



Sentinel-2 (12/12/2019)



Sentinel-1 (12/21/2019)



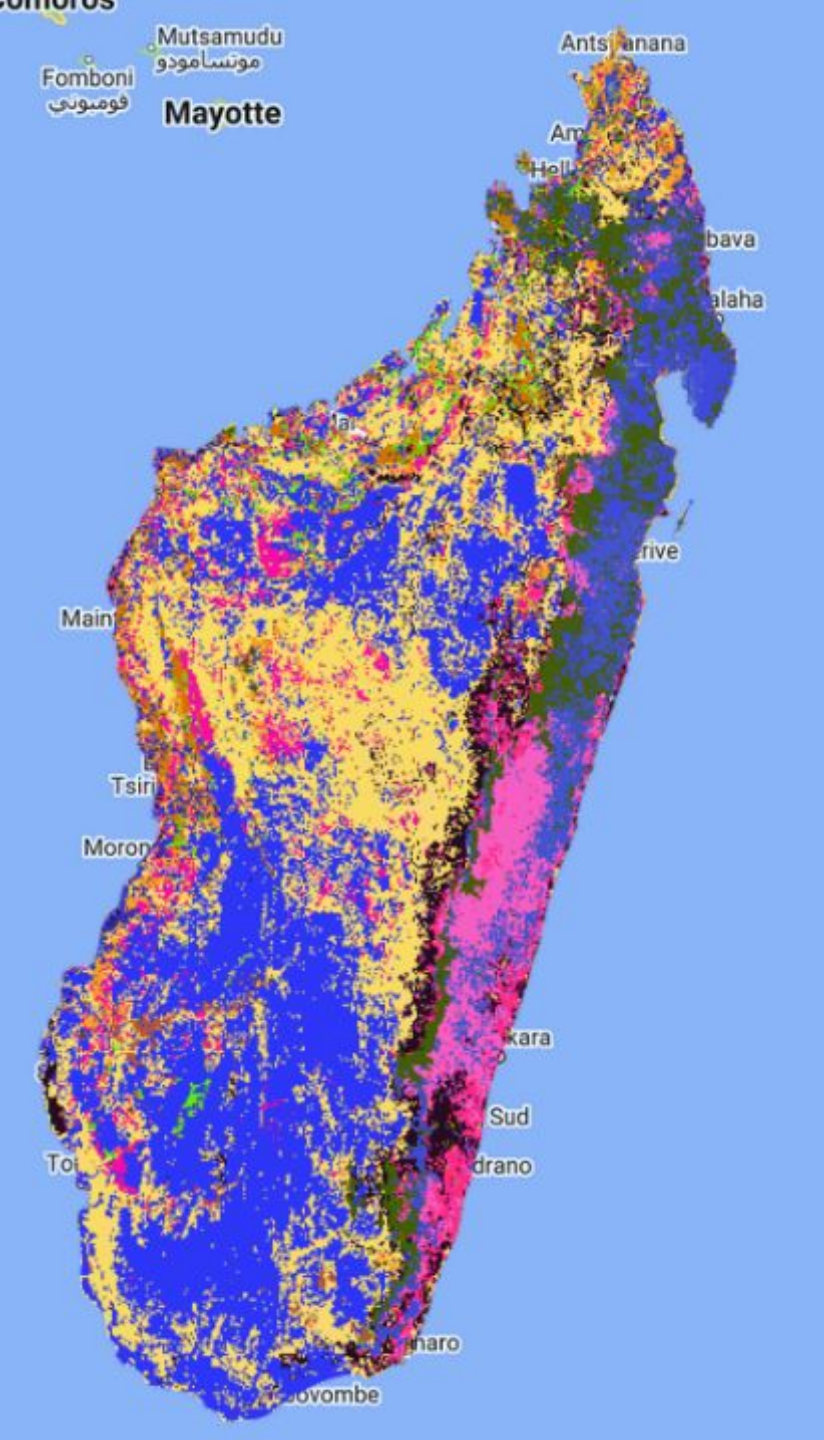
Planet (10/26/2019)



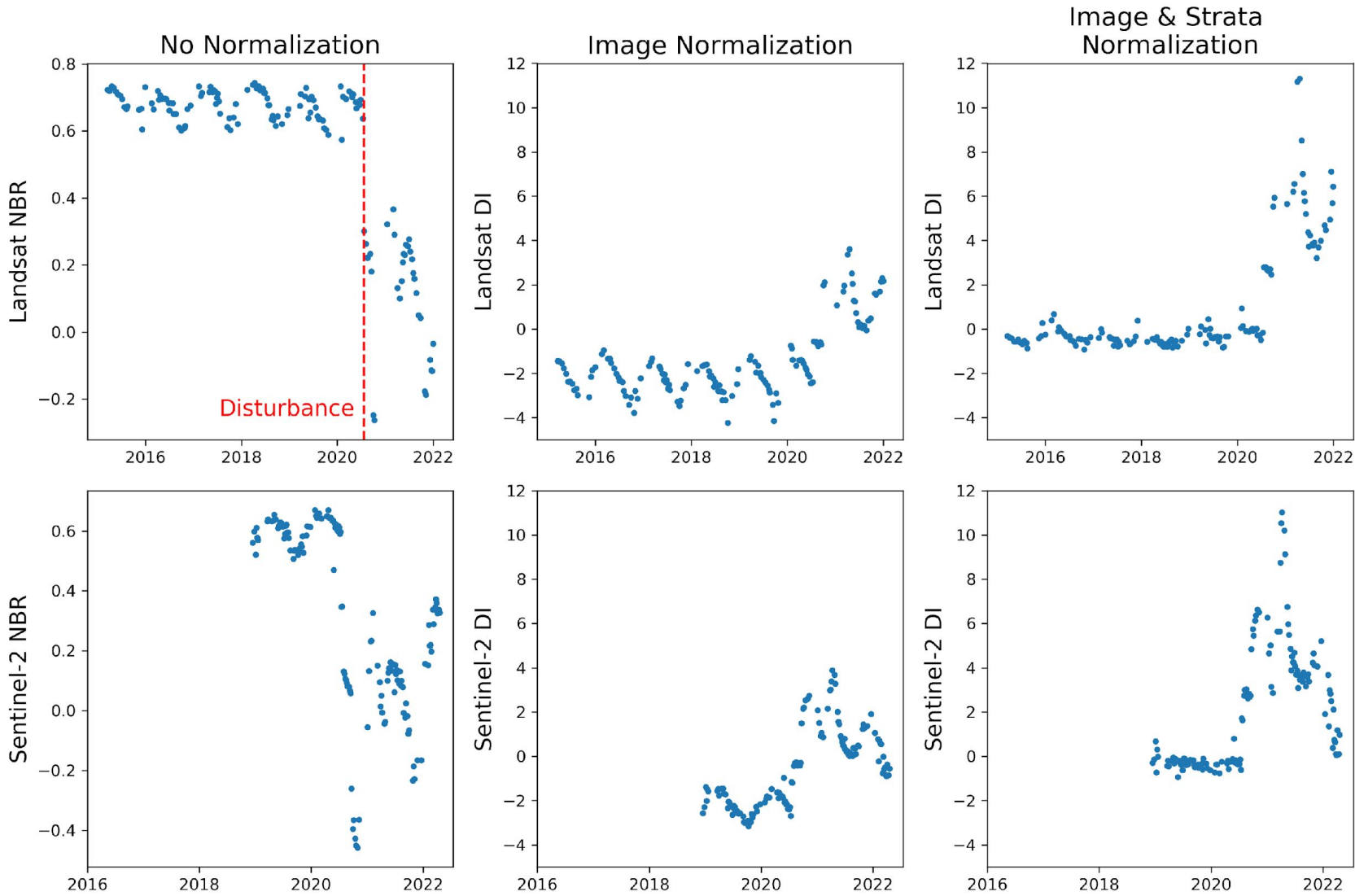
1. Reflectance or  
backscatter data

$$DI_{NBR} = \frac{X_{NBR} - \mu_{NBR}}{\sigma_{NBR}}$$

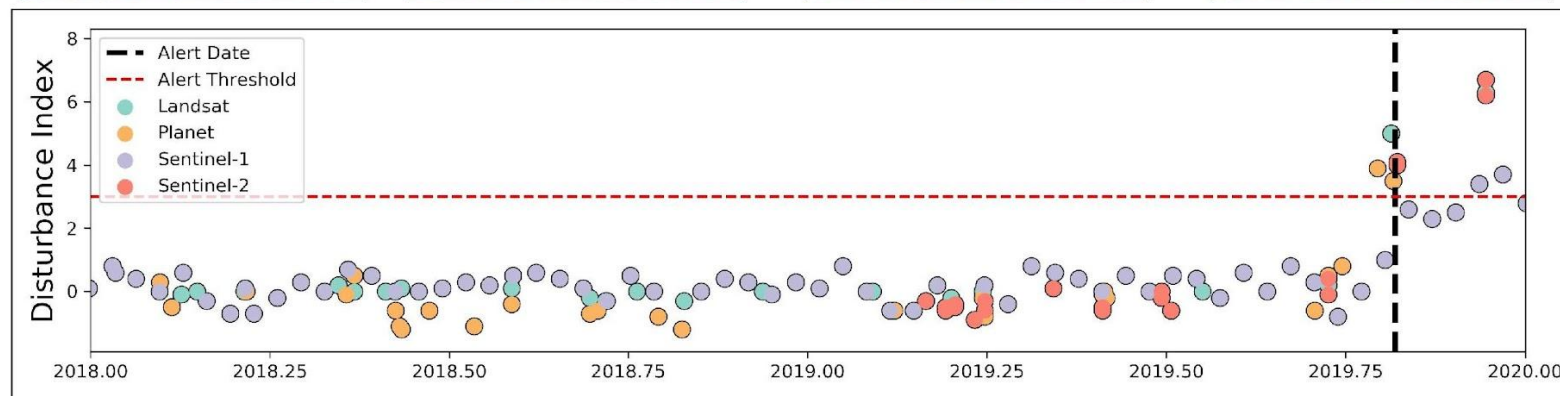
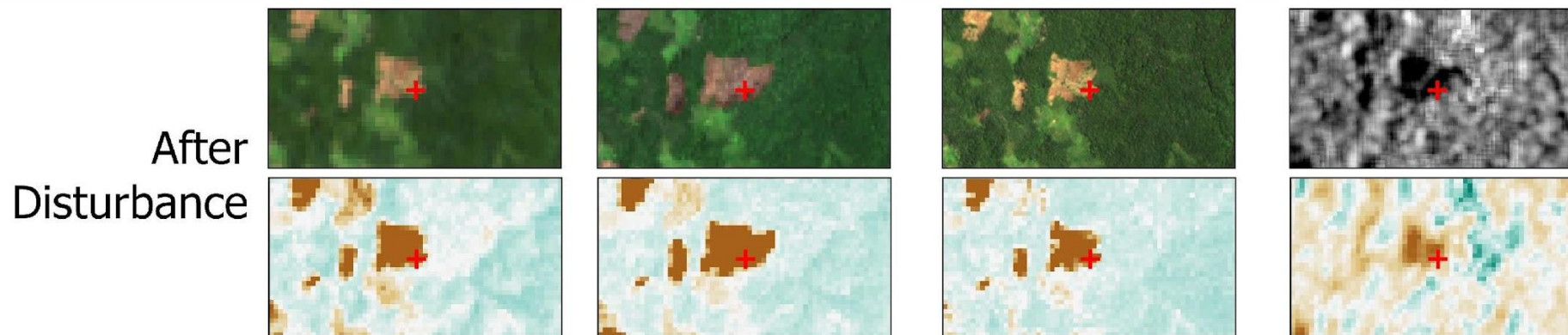
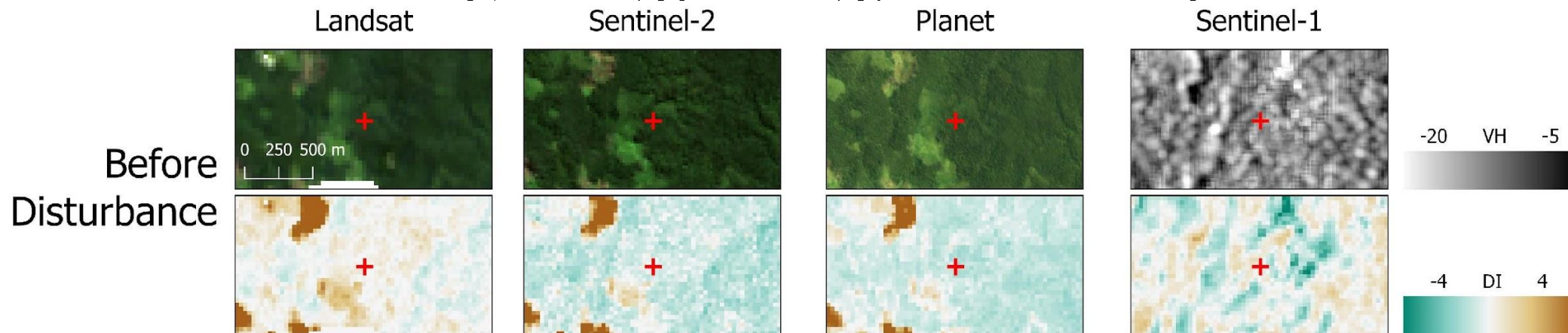




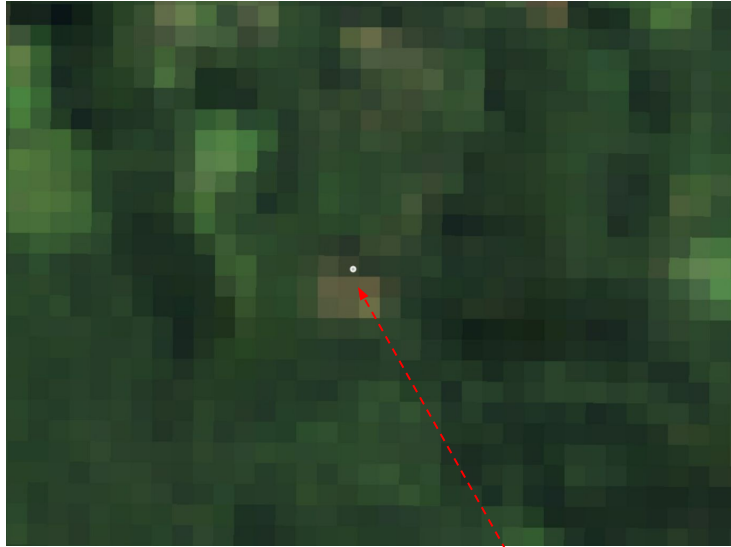
# Normalizing by forest population with similar seasonal characteristics reduces seasonal effects



# Combining $DI_T$ , $DI_{S1}$ , $DI_{S2}$ , and $DI_P$



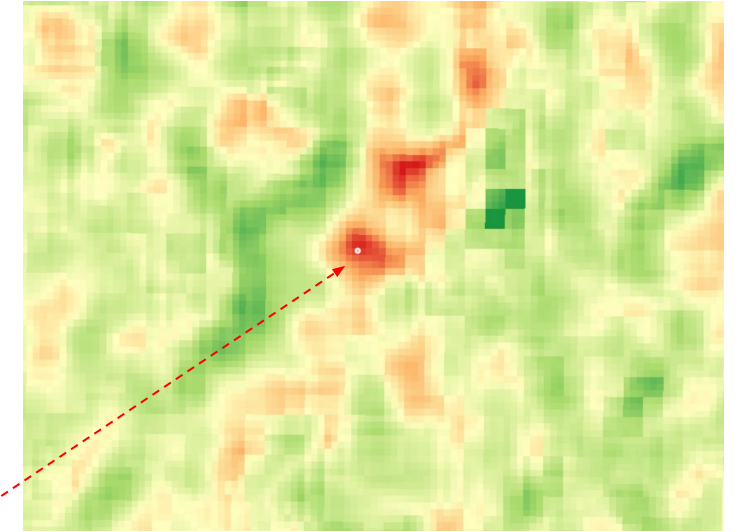
Landsat RGB 6/14/2020



Sentinel-2 RGB 8/8/2020

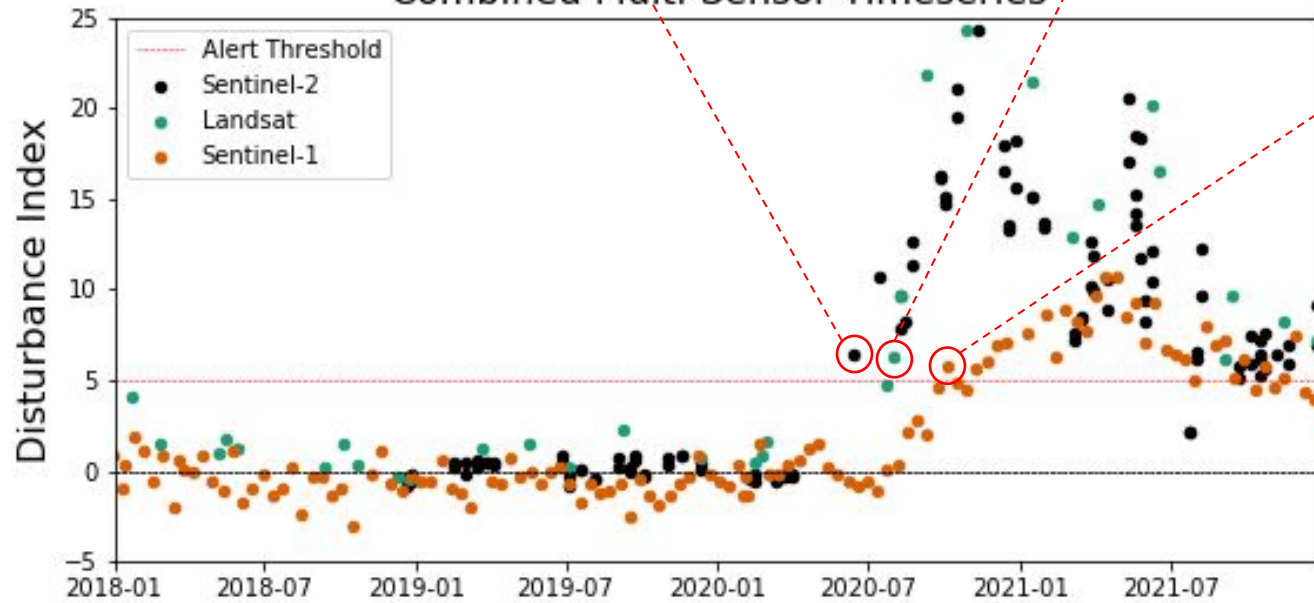


Sentinel-1 VH 10/4/2020



Stretch: Red -> Yellow -> Green

Combined Multi-Sensor Timeseries



Planet Mosaic 12/2020



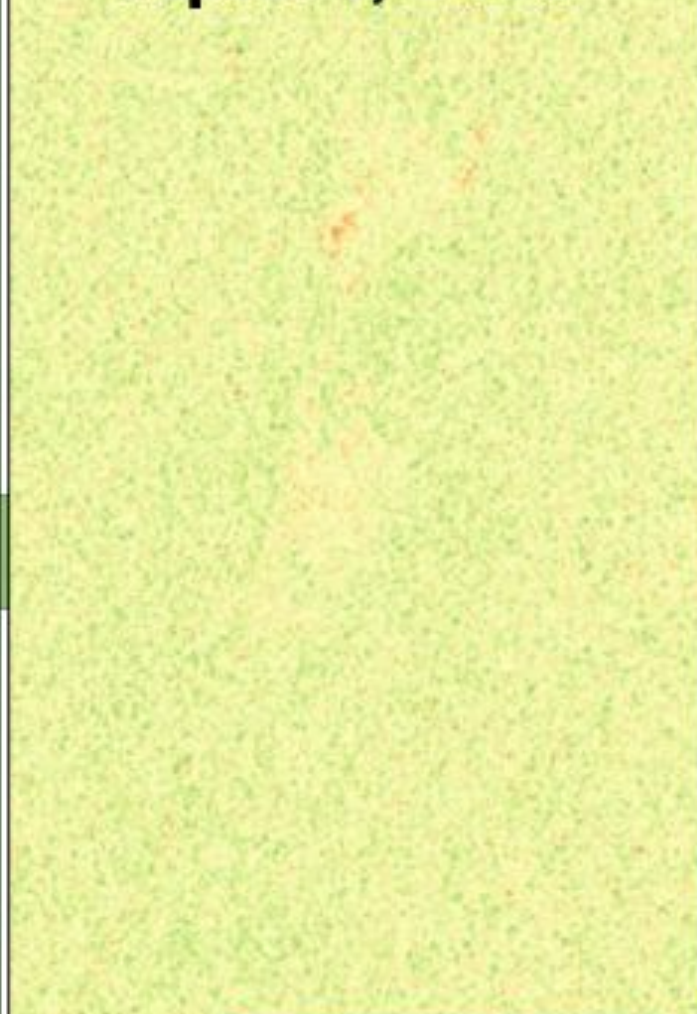
Planet Mosaic 11/2021



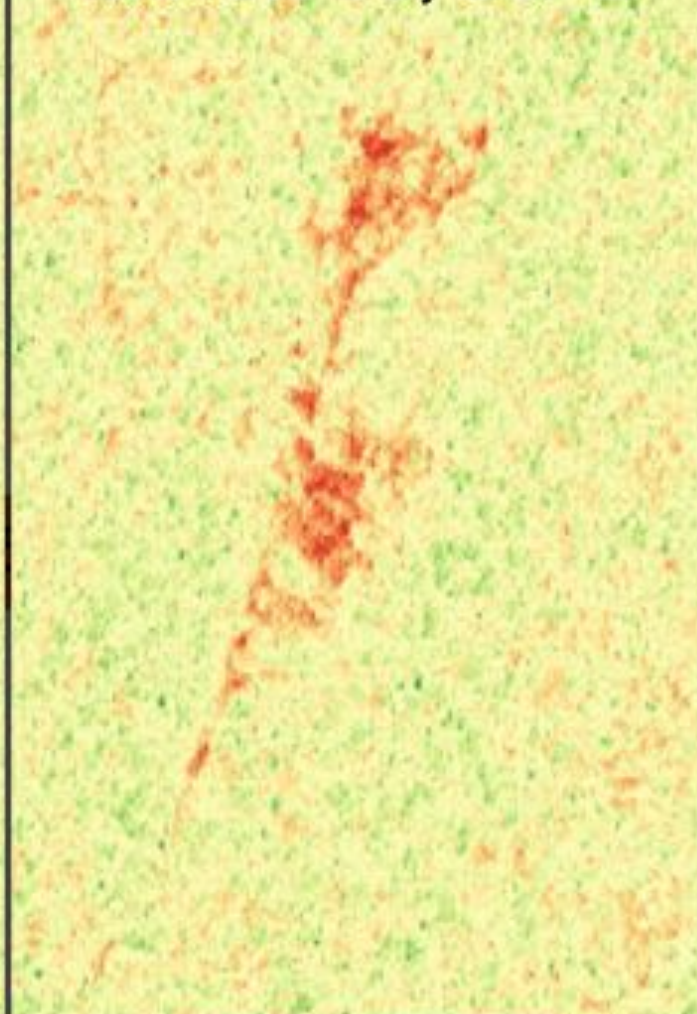
**Planet NICFI  
March 2022**



**Sentinel-1 DI (VH)  
April 4, 2022**



**PALSAR-2 DI (HV)  
March 30, 2022**



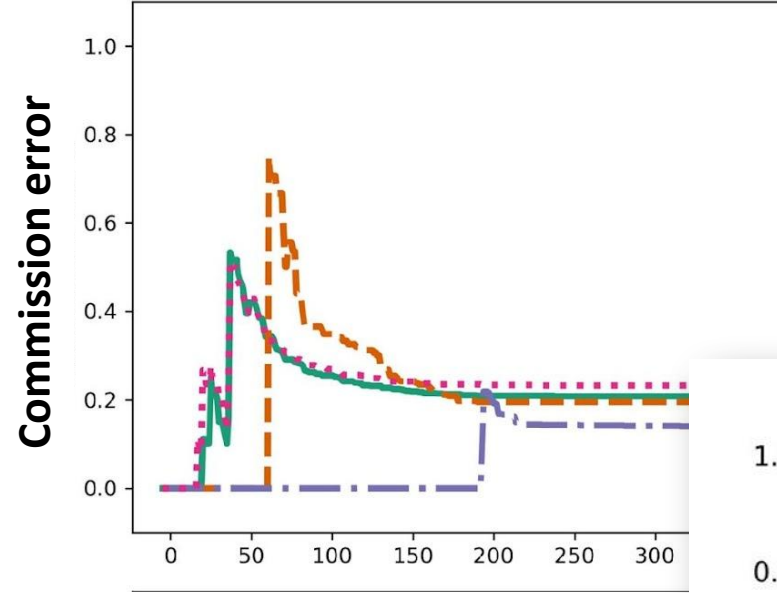
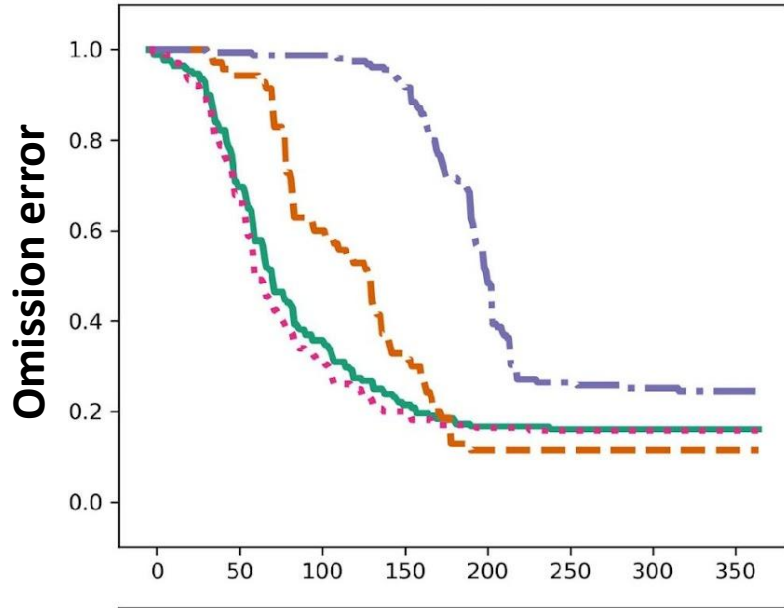
**-5**

**Disturbance Index**

**5**

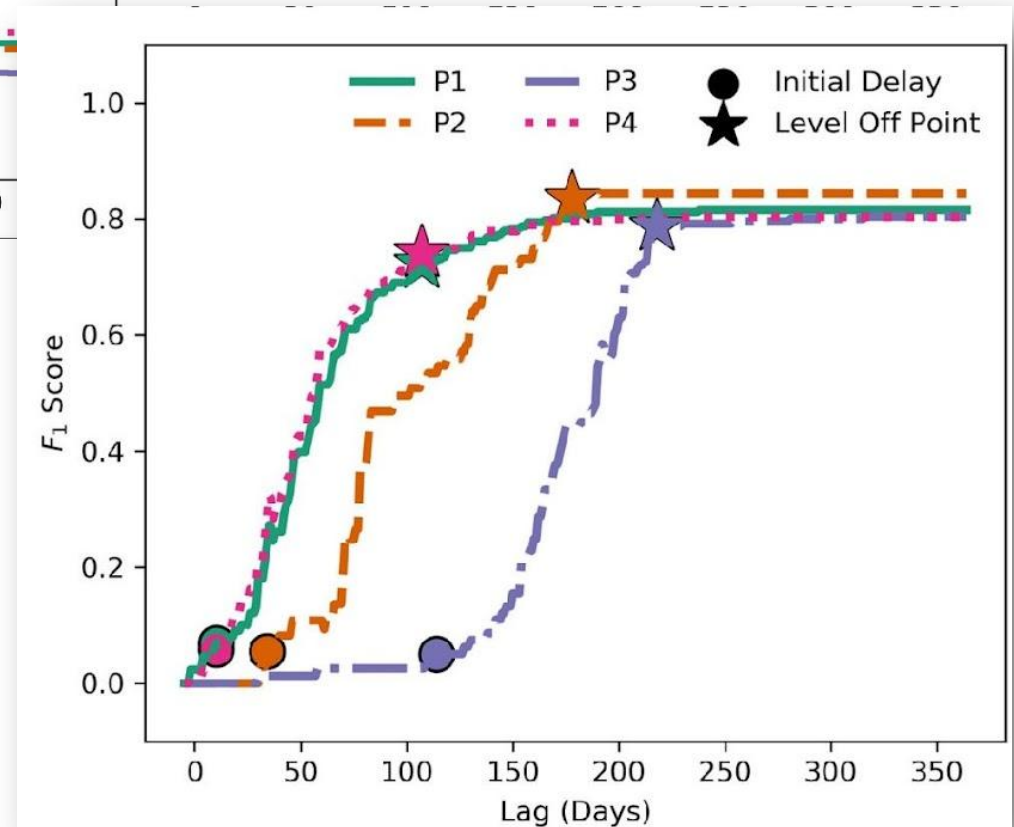
# Including timeliness in accuracy assessment

Event-Based Agreement



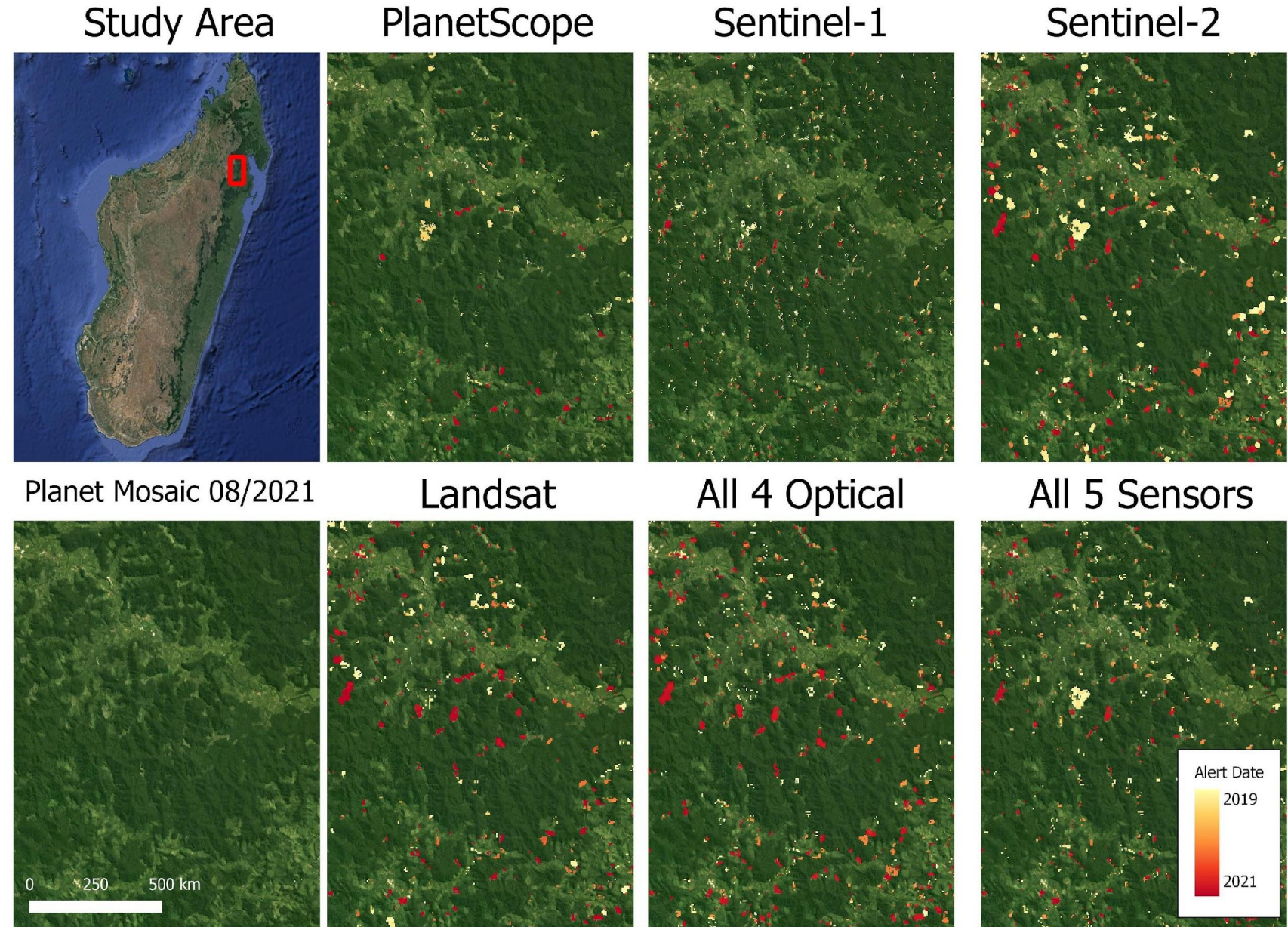
Lag (Days after event)

## Sigmoid Accuracy



# Case Study

- 2019-2020
- 6 configurations of input data
- Humid tropical forests
- Stratified random sample (n=960) with precise change date attribution



## Confidence

**Low confidence: 1 observation above change threshold**  
**High confidence: 2 observations above change threshold**

Alert Confidence


 Low

 High

## Disturbance Date

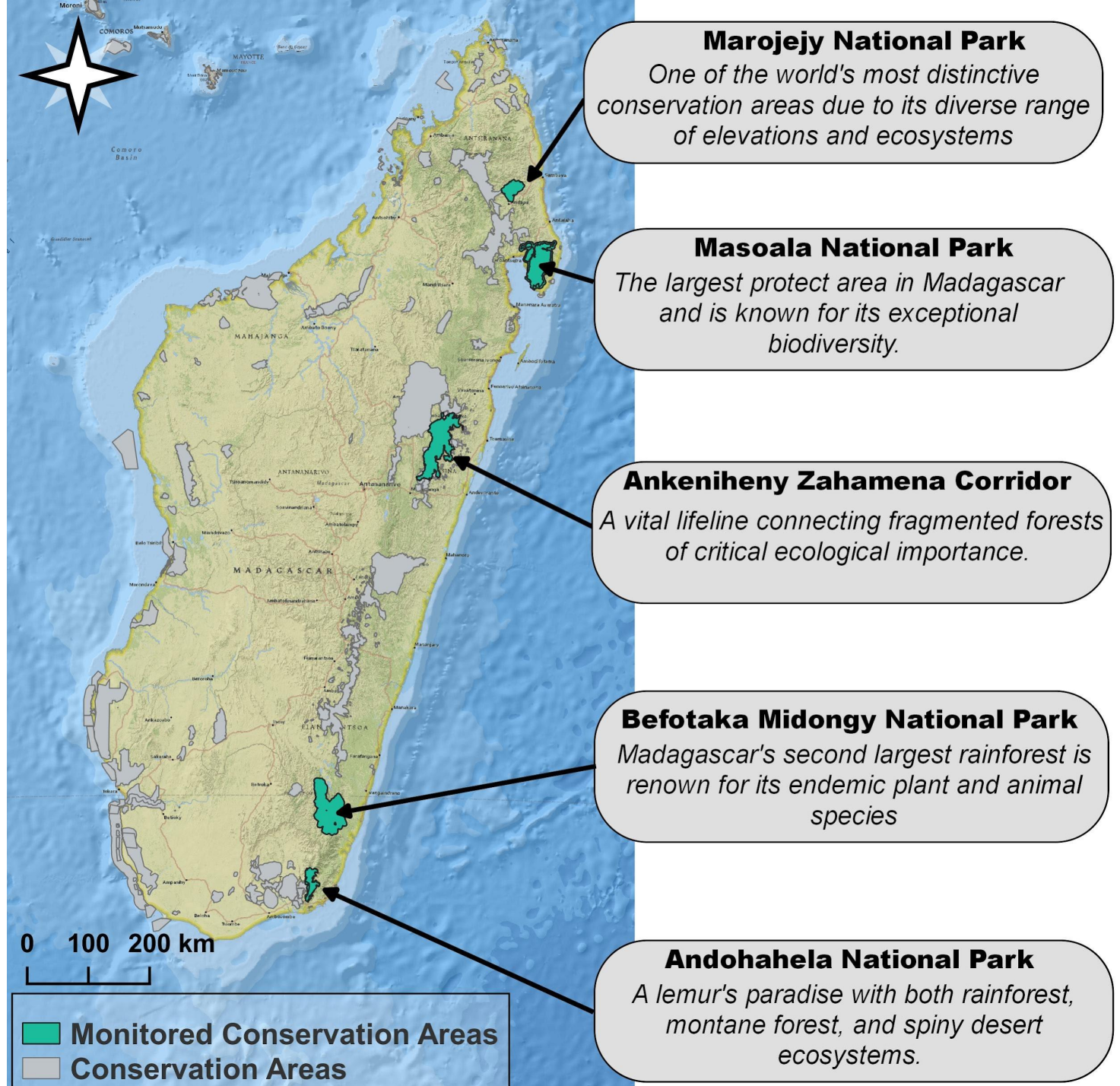
Alert Date

 2019

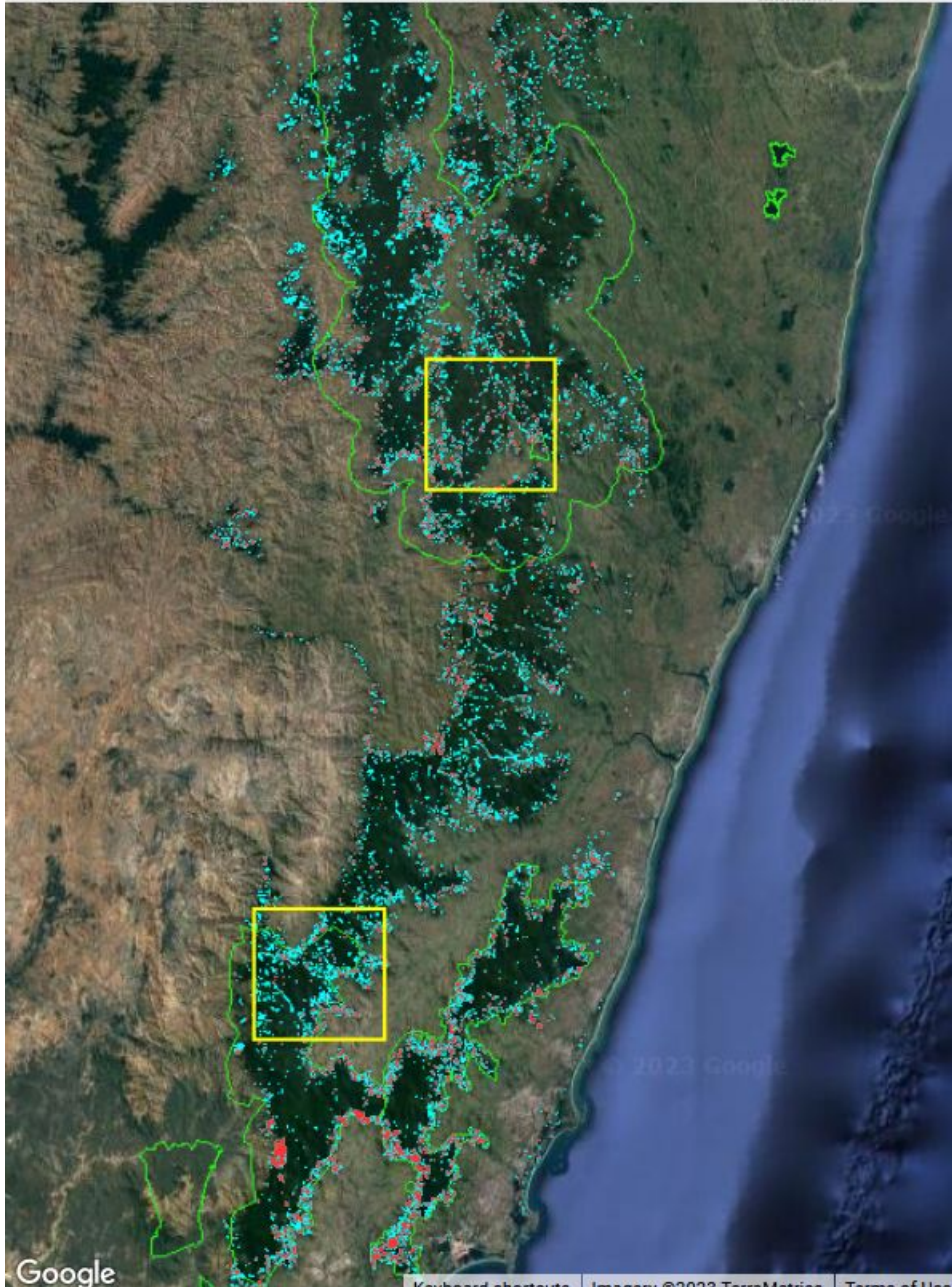
 2021

We're setting up five 2-year demonstration window in protected areas of varying cloudiness

Using Planet quota donated by FAO







### Forest Disturbance Alerts (Beta)

**Map Data:** Daily Forest Disturbance Alerts

**Algorithm:** Disturbance Index Alert System (DIAS)

**Inputs:** Landsat, Sentinel-2, Planet, and Sentinel-1

**Updated:** April 11, 2023

#### Alert Confidence

High

Low

#### Ancillary Layers

Protected Areas

Study Areas

#### Filter by Alert Date:

Start:

End:

9 30 Oct 2 3 4 5 6

3 4 5 6 7 8 9 10

10 / 01 / 2022

04 / 10 / 2023

Oct 1, 2022

Apr 10, 2023

10 / 01 / 2022

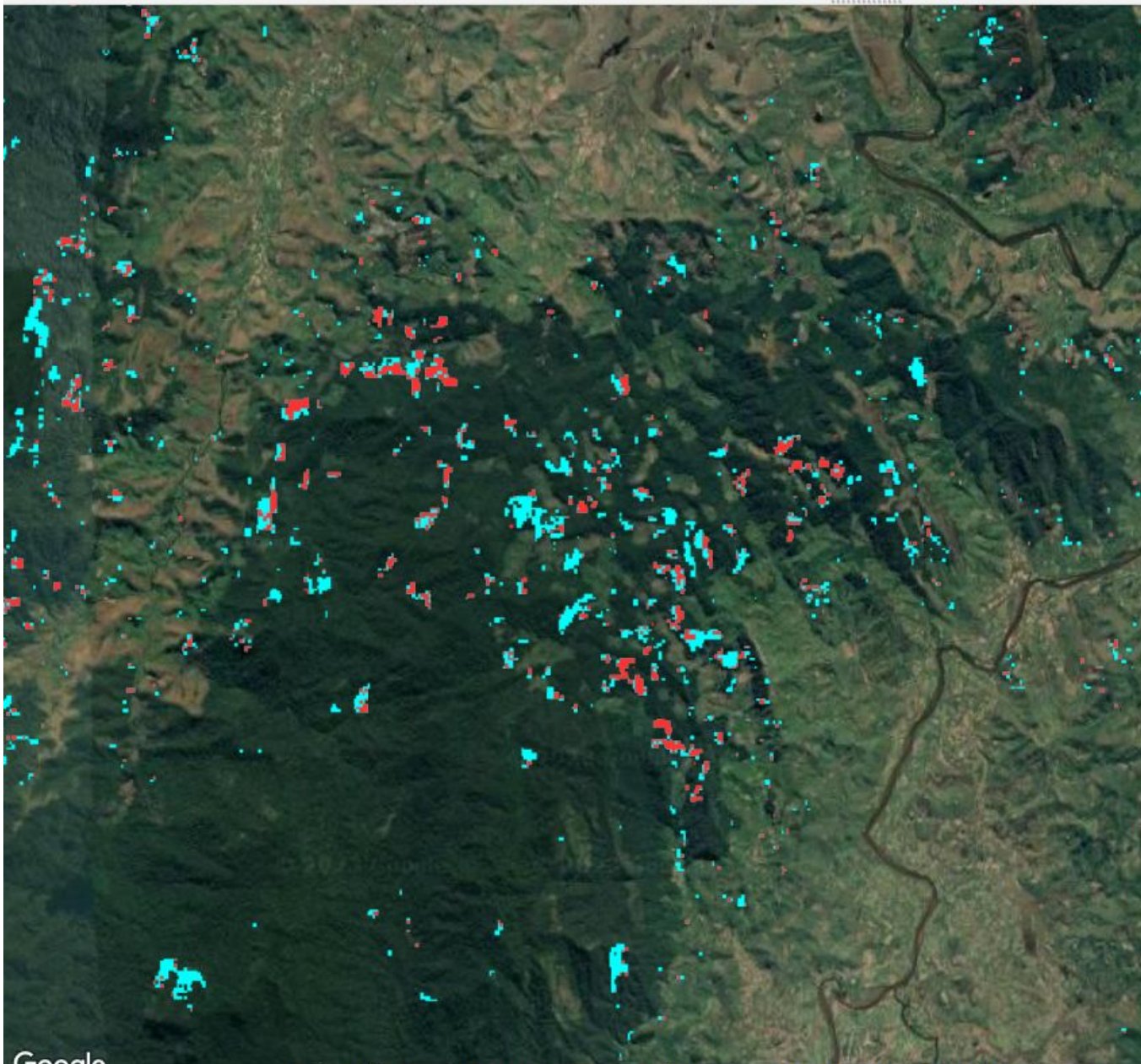
04 / 10 / 2023

#### Disturbance Detection Dates

Click on the map

Low Confidence: 2022-3-1

High Confidence: 2022-3-7



### Forest Disturbance Alerts (Beta)

**Map Data:** Daily Forest Disturbance Alerts

**Algorithm:** Disturbance Index Alert System (DIAS)

**Inputs:** Landsat, Sentinel-2, Planet, and Sentinel-1

**Updated:** April 11, 2023

#### Alert Confidence

High

Low

#### Filter by Alert Date:

Start:

End:

9 30 Oct 2 3 4 5 6

3 4 5 6 7 8 9 10

Calendar navigation for start date

Calendar navigation for end date

Oct 1, 2022

Apr 10, 2023

10 / 01 / 2022

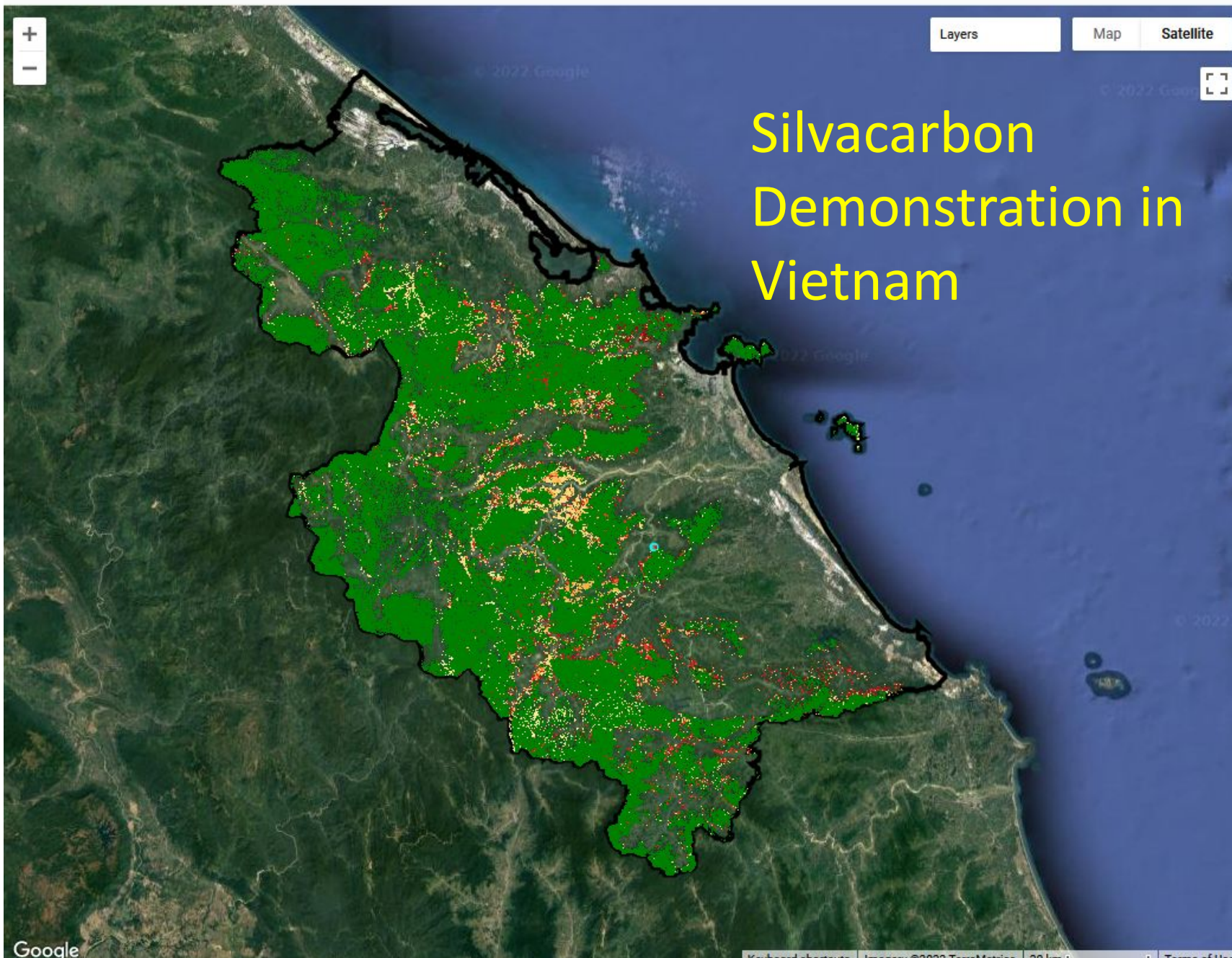
04 / 10 / 2023

#### Disturbance Detection Dates

Click on the map

Low Confidence: 2022-3-1

High Confidence: 2022-3-7



## Silvacarbon Demonstration in Vietnam

### Disturbance Index Alerts (Beta)

Forest disturbance alerts identified in a combined time series of Sentinel-1, Sentinel-2, and Landsat images.

#### Legend

Study Area

Field Site

Alert Date

2021  2023

#### Display Options

Background Imagery:

Alert Format:

Sensors:  Landsat  Sentinel-2  Sentinel-1

Start:

End:

2021 3 4 5 6 7 8 9 1 9 30 Dec 2 3 4 5 6 7 8

Jan 1, 2021

Dec 1, 2022

#### Dates of Detection and Alerts:

First Identified: 2022-4-25

Confirmed Alert: 2022-4-27



### Disturbance Index Alerts (Beta)

Forest disturbance alerts identified with a combined time series of Sentinel-1, Sentinel-2, and Landsat images.

#### Legend

Study Area

Alert Date



#### Display Options

Background Imagery: Google Satellite

Alert Format: Alert Date

Input Sensors: Default

Start: Oct 1, 2021  
End: Dec 1, 2022

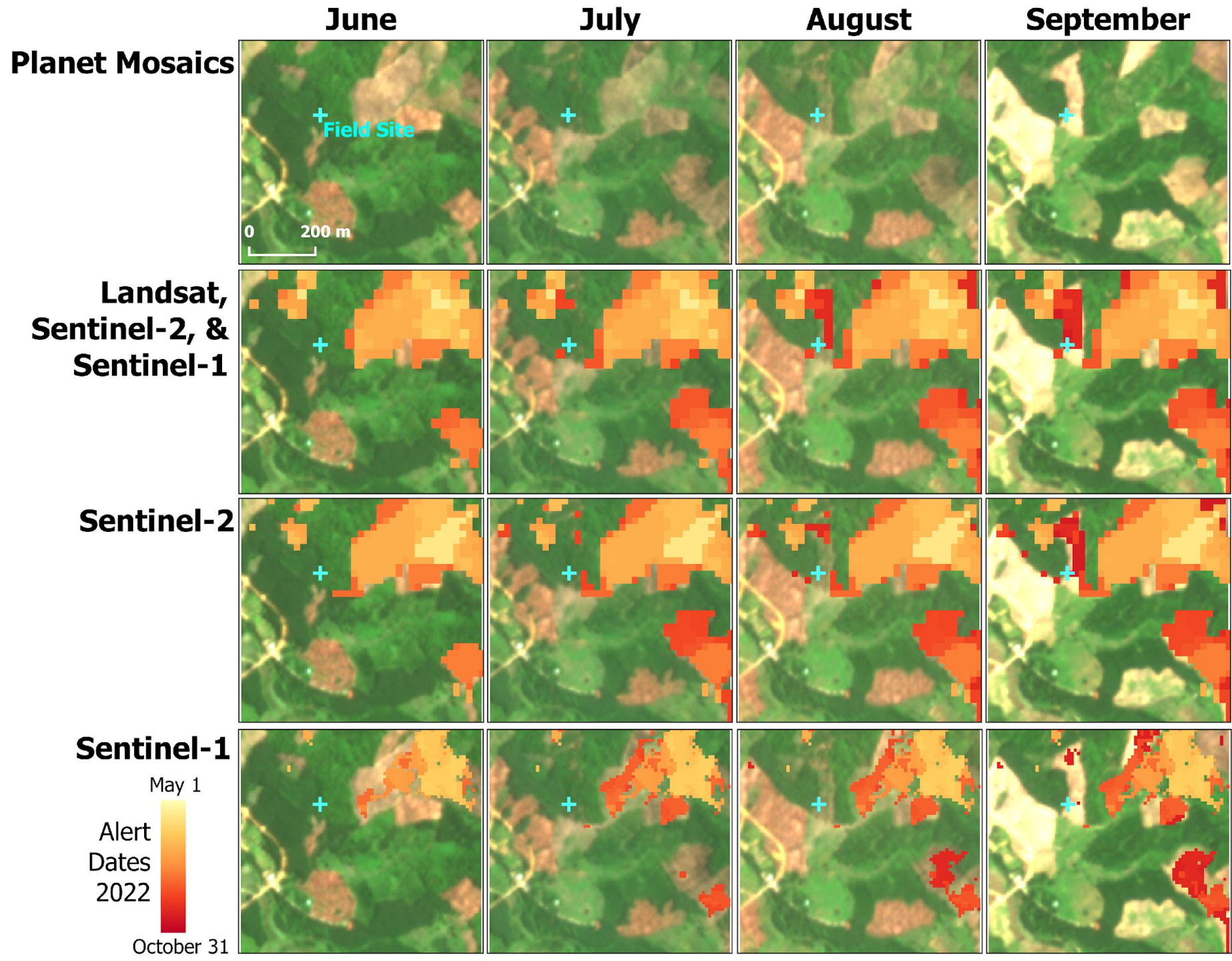
10 / 01 / 2021    12 / 01 / 2022

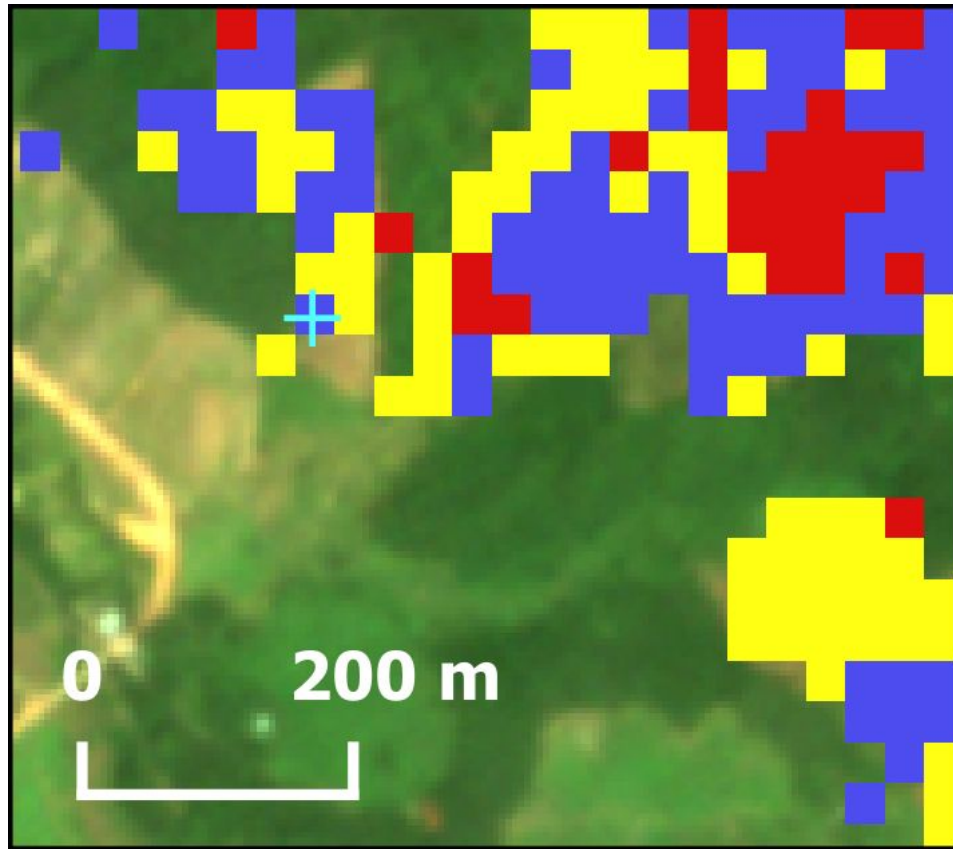
#### Dates of Detection and Alerts:

First Identified: 2022-3-23




Confirmed Alert: 2022-3-29

# Vietnam Field Site





**Alert triggered  
by DI image  
from this  
sensor:**

-  Landsat
-  Sentinel-2
-  Sentinel-1

**Even in this small area, all 3 sensors were important in detecting change as soon as possible**