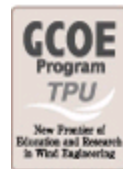




# Post-Storm Satellite Images to Trace Tornado Damage Path from the Wind Borne Debris Deposits

**Authors: Sudha Radhika, Yukio Tamura, Masahiro Matsui**

**The Second Asia/Oceania Meteorological Satellite Users' Conference**  
**6 - 9 December, Tokyo/Japan**





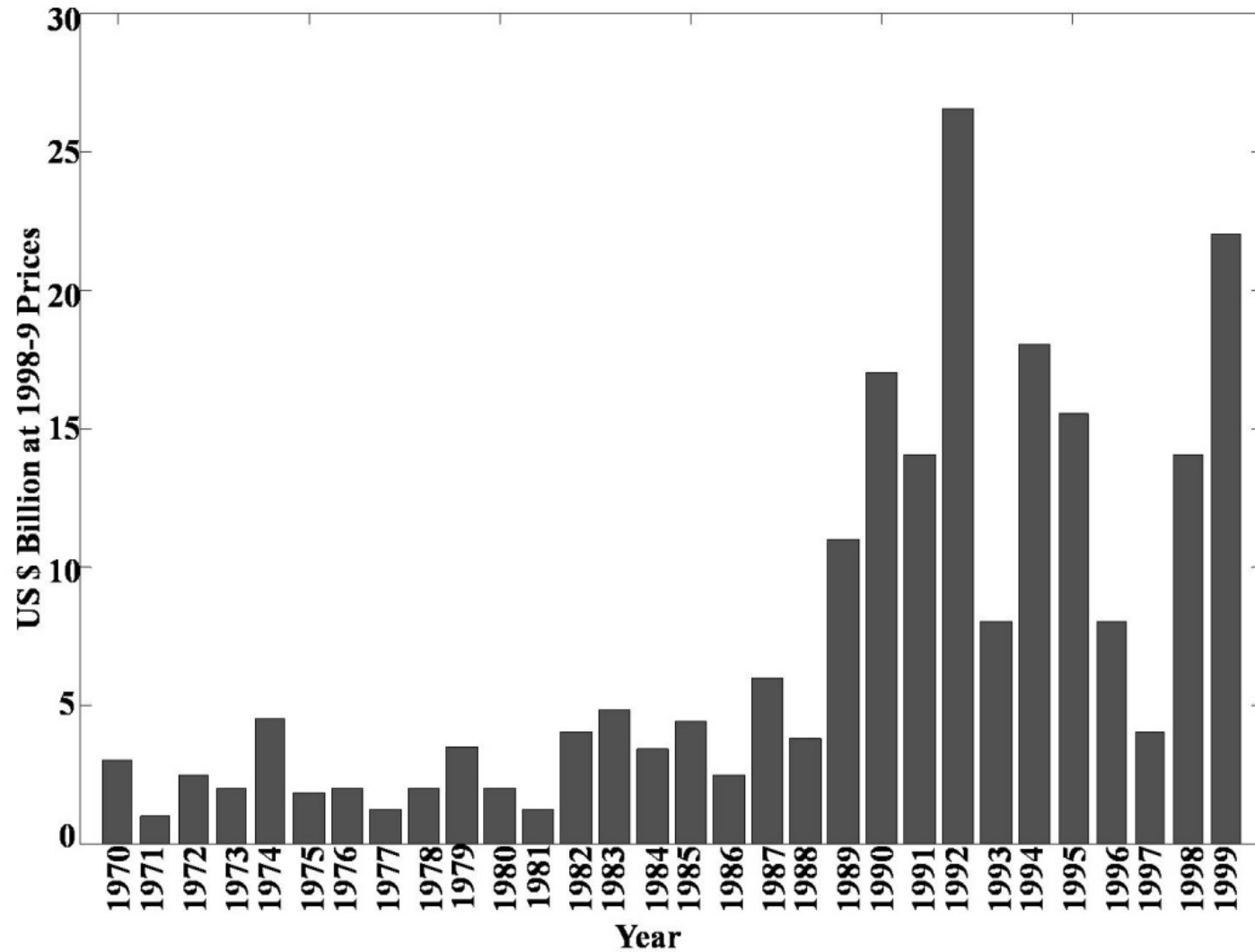
# AIM

To identify the Tornado damage path from the Post-storm Satellite/Aerial Imageries alone, by using Texture-Wavelet analysis on the scattered wind borne debris

# **NATURAL DISASTER: STRONG WINDS**

**Tornadoes**

**Tropical Cyclones**



**Bar chart showing the World insurance losses from major natural disasters (1970-1999) Source: Swiss Reinsurance Company**





# Field investigation





# SATELLITE IMAGES

2004/03/23 PUNTA GORDA

2004/08/14 PUNTA GORDA



**QuickBird Multi-spectral Satellite imagery of 2.44 m/pixel Resolution**



# PAST RESEARCHES

➤ Tornado track identification from **pre- and post-storm satellite imageries** by Soe et al 2008 and Thomas et al 2002 by **change detection**

➤ **Cyclone damages** to buildings were estimated from **pre- and post-storm satellite imageries** by Womble et al 2007



# PAST RESEARCHES

## Difficulties

- Capturing the **exact pre-storm location** as that of the post-storm
- **Complicated and time consuming** image-registration procedure
- **Cost**
- **Generalization**



# SOLUTIONS

## ➤ **Texture-Wavelet** analysis

(2D biorthogonal spline wavelet)

→ **More Accurate**

## ➤ **Post-storm** satellite/aerial image **alone**

→ **Faster damage identification**

**Save more lives and more building structures can be restored faster.**

# **IMAGE PROCESSING: TEXTURE WAVELET ANALYSIS**



# WHY TEXTURE-WAVELET ANALYSIS?

1. **Particular Texture** (*Wind Borne Debris*)

→ **Texture Analysis**

2. **Sharp Broken Edges**

3. **Irregularly arranges pixels**

(*High Pass information*)

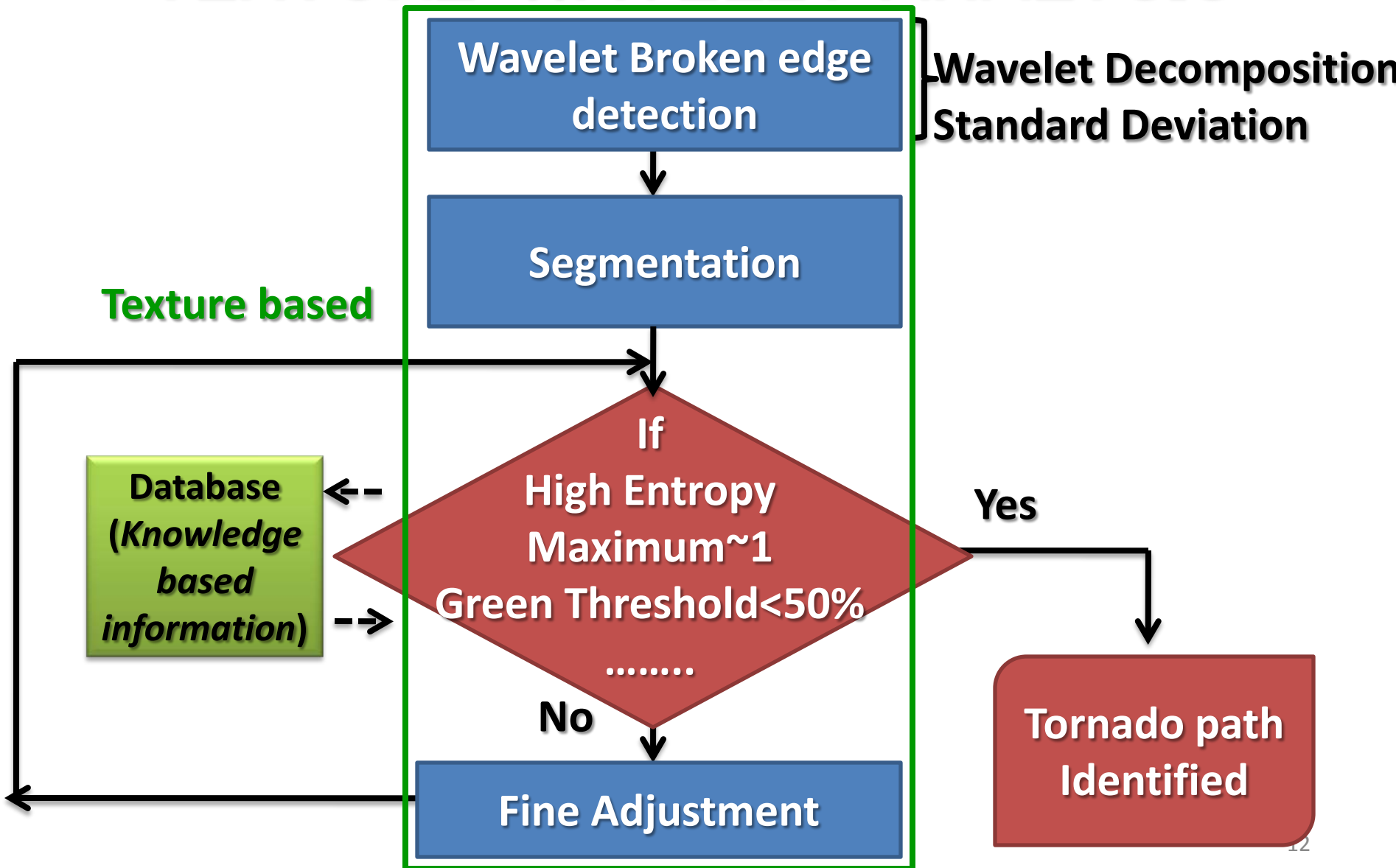


→ **Wavelet Analysis**

→ **Texture-Wavelet Analysis**



# TEXTURE-WAVELET ANALYSIS

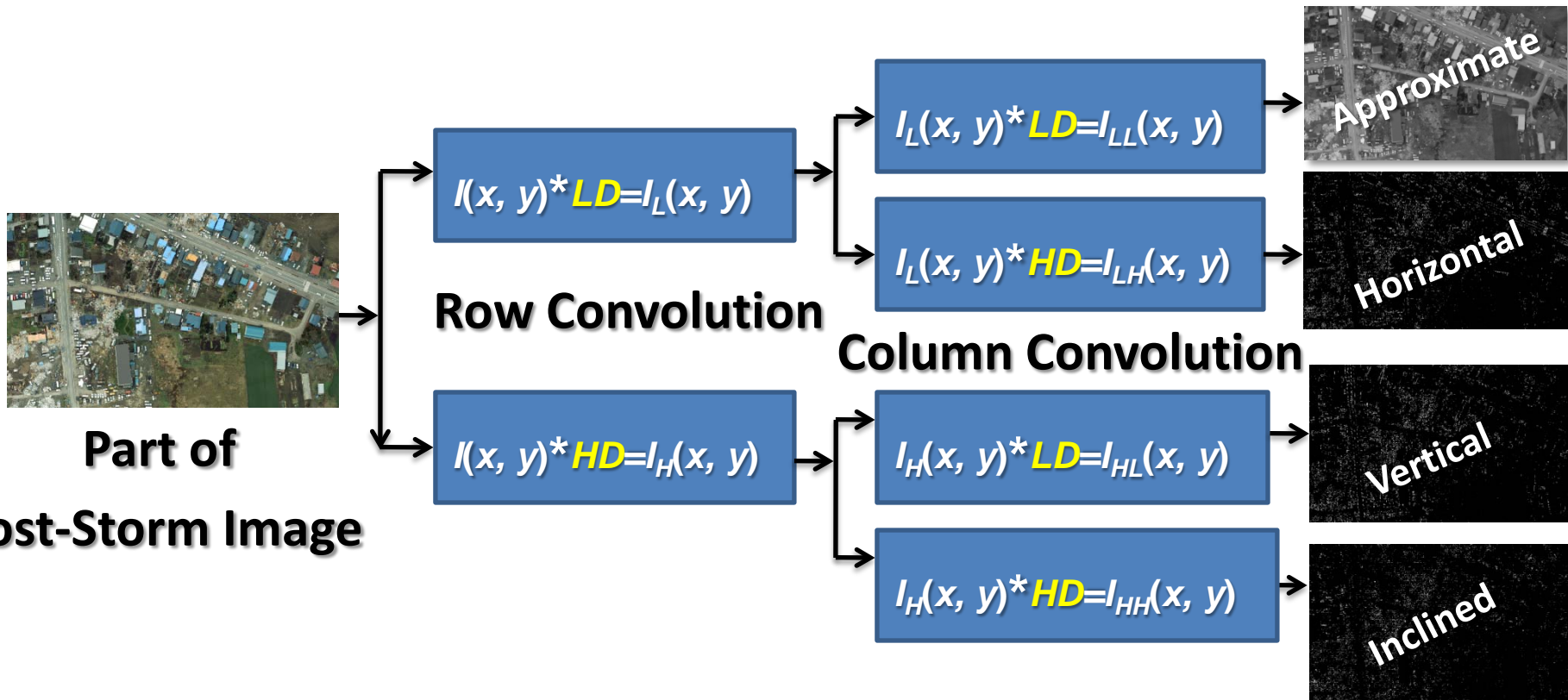




# AN IMAGE PORTION AFTER TORNADO DAMAGE



# WAVELET DECOMPOSITION



$$c(n_1, n_2) = \sum_{k_1 = -\infty}^{\infty} \sum_{k_2 = -\infty}^{\infty} a(k_1, k_2) b(n_1 - k_1, n_2 - k_2)$$

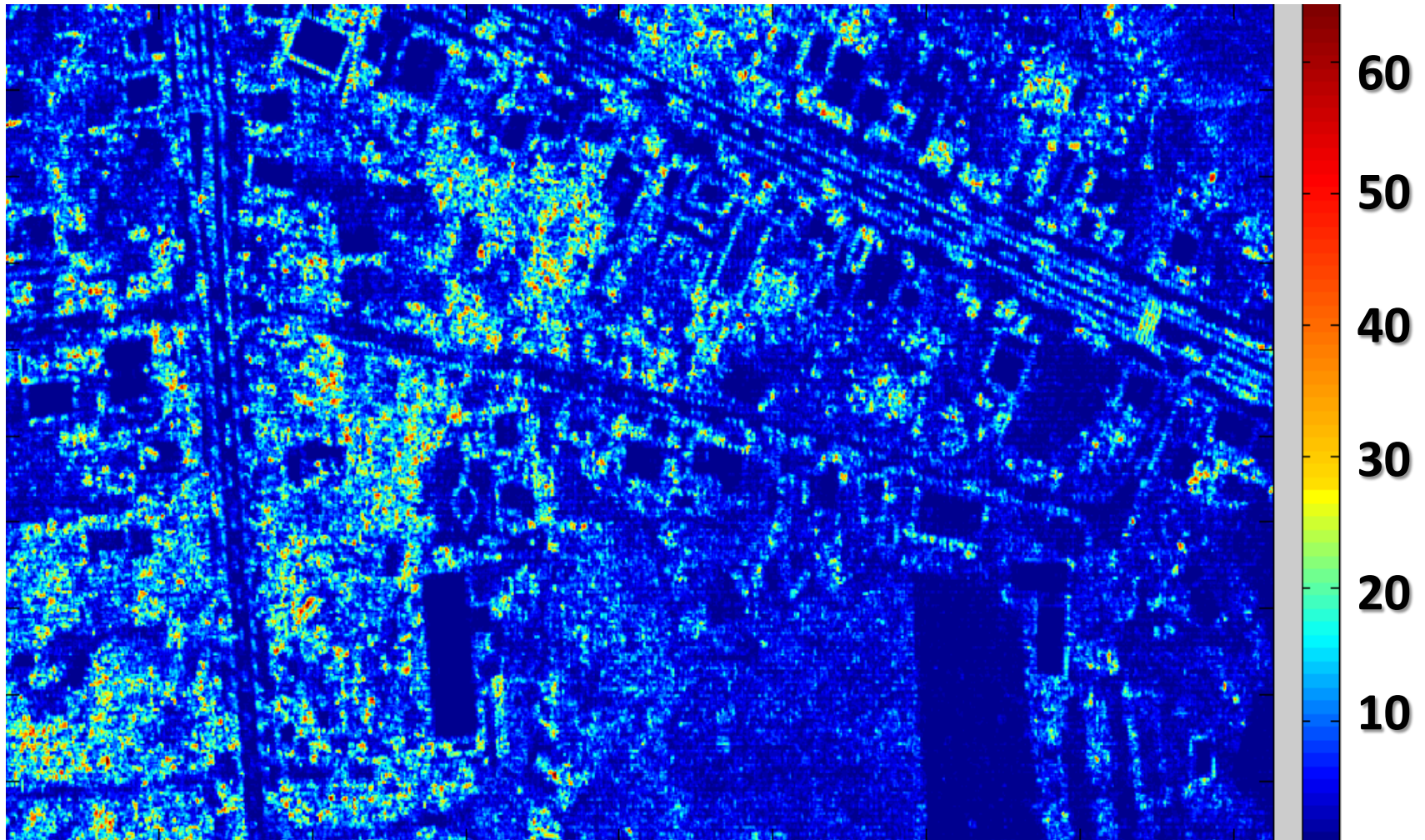


# BROKEN EDGES DETECTED-WAVELET





# STANDARD DEVIATION





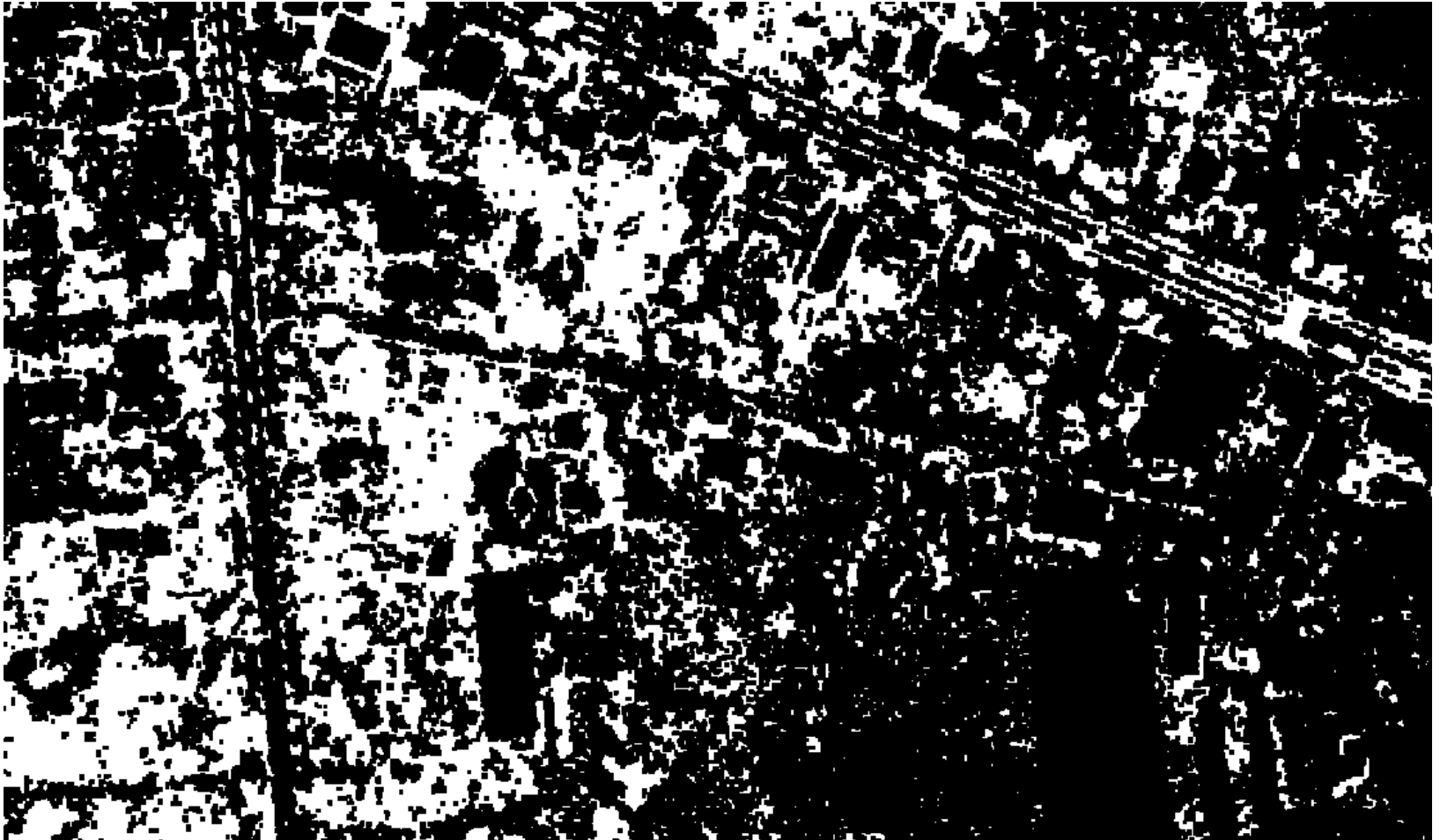
# SEGMENTATION

## Otsu's thresholding Method

- Object
  - Background
- Maximize the separability between two classes
- Calculate the threshold (OTSU 1979)
- Segmentation

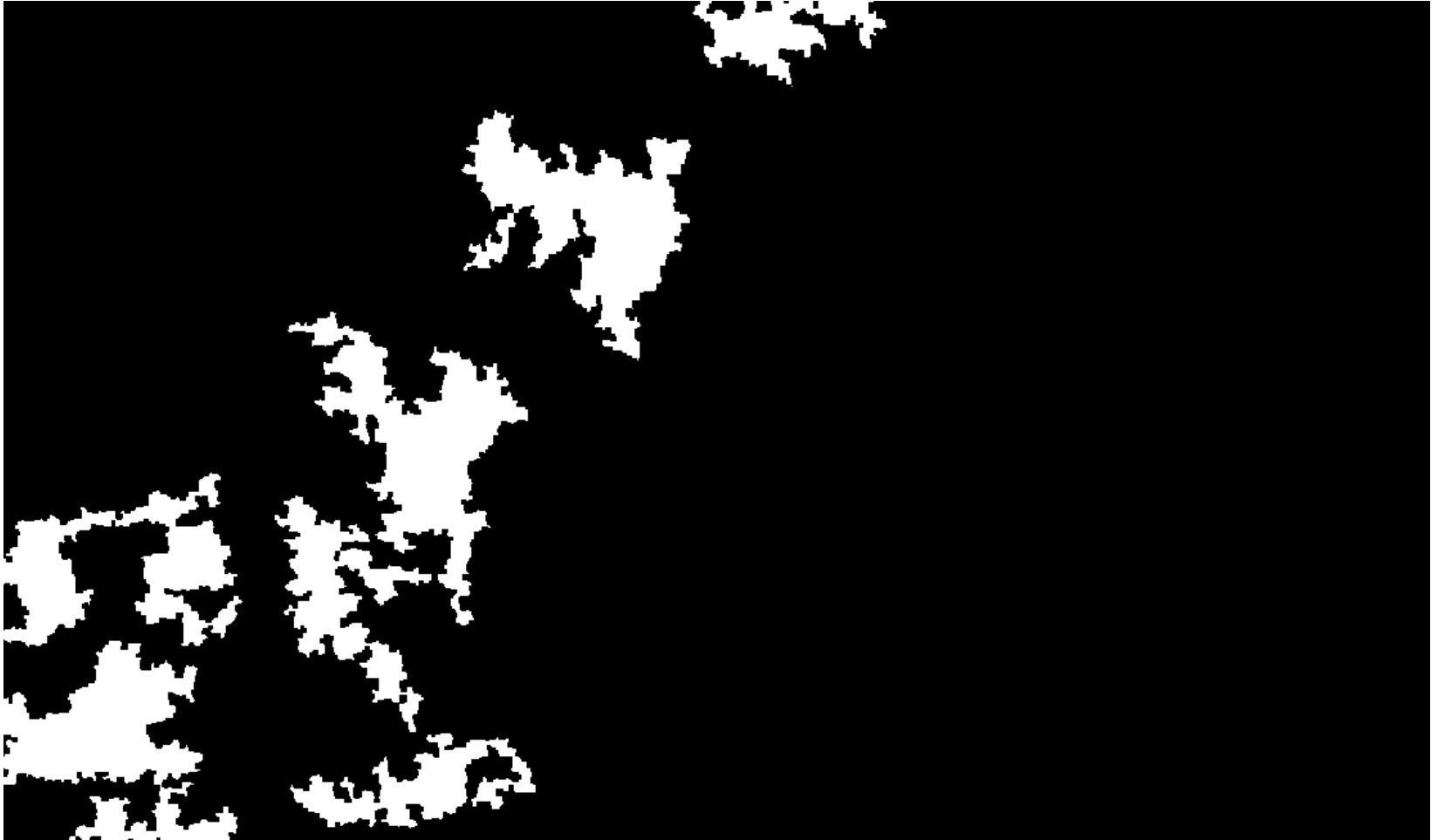


# OTSU' S THRESHOLDING METHOD





# NOISE REMOVAL



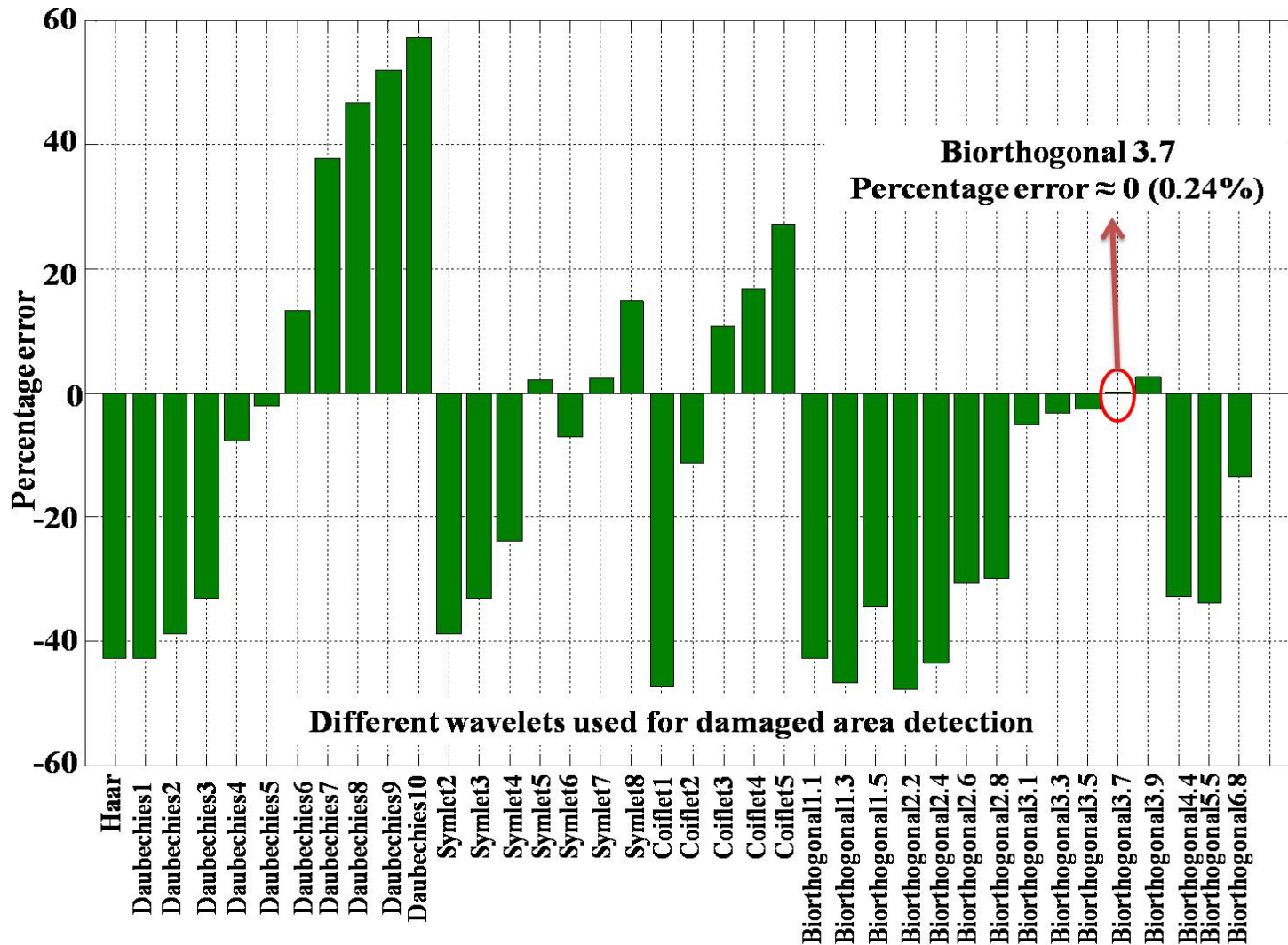


# DEBRIS MASKED





# DEBRIS PATTERN RECOGNITION



# **SATELLITE AND AERIAL IMAGES**

*Key words*

**Image: Multispectral/RGB visible imagery**

**Resolution: Distance/pixel**



# SAROMA-CHO TORNADO



## LOCATION

**On November 7<sup>th</sup> 2006  
at Saroma town  
in Hokkaido**



**Image Courtesy: Kyodo News and Akihiro Takahashi, Northern Regional Building Research Institute**





# POST-STORM AERIAL IMAGERY



**Resolution: 10cm/pixels**

**Image Courtesy: Shin Engineering Consultants Co. Ltd., Japan**





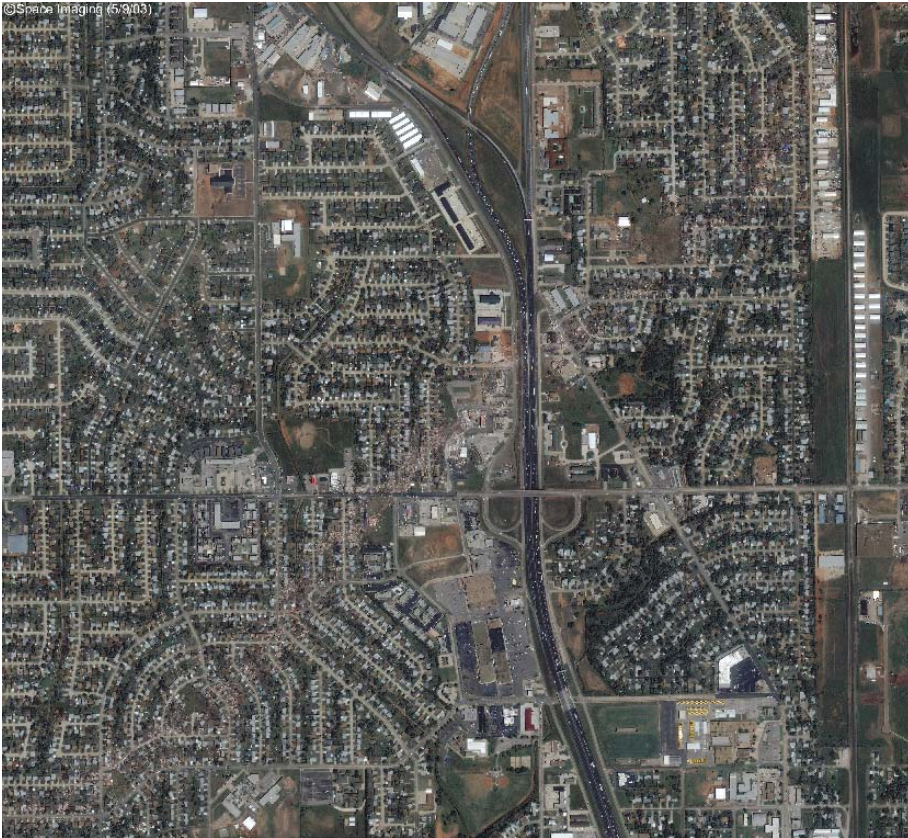
# TORNADO FOOT PRINTS IDENTIFIED : Automatically





# MOORE, OKLAHOMA, US TORNADO SATELLITE IMAGERY (1m/pixel)

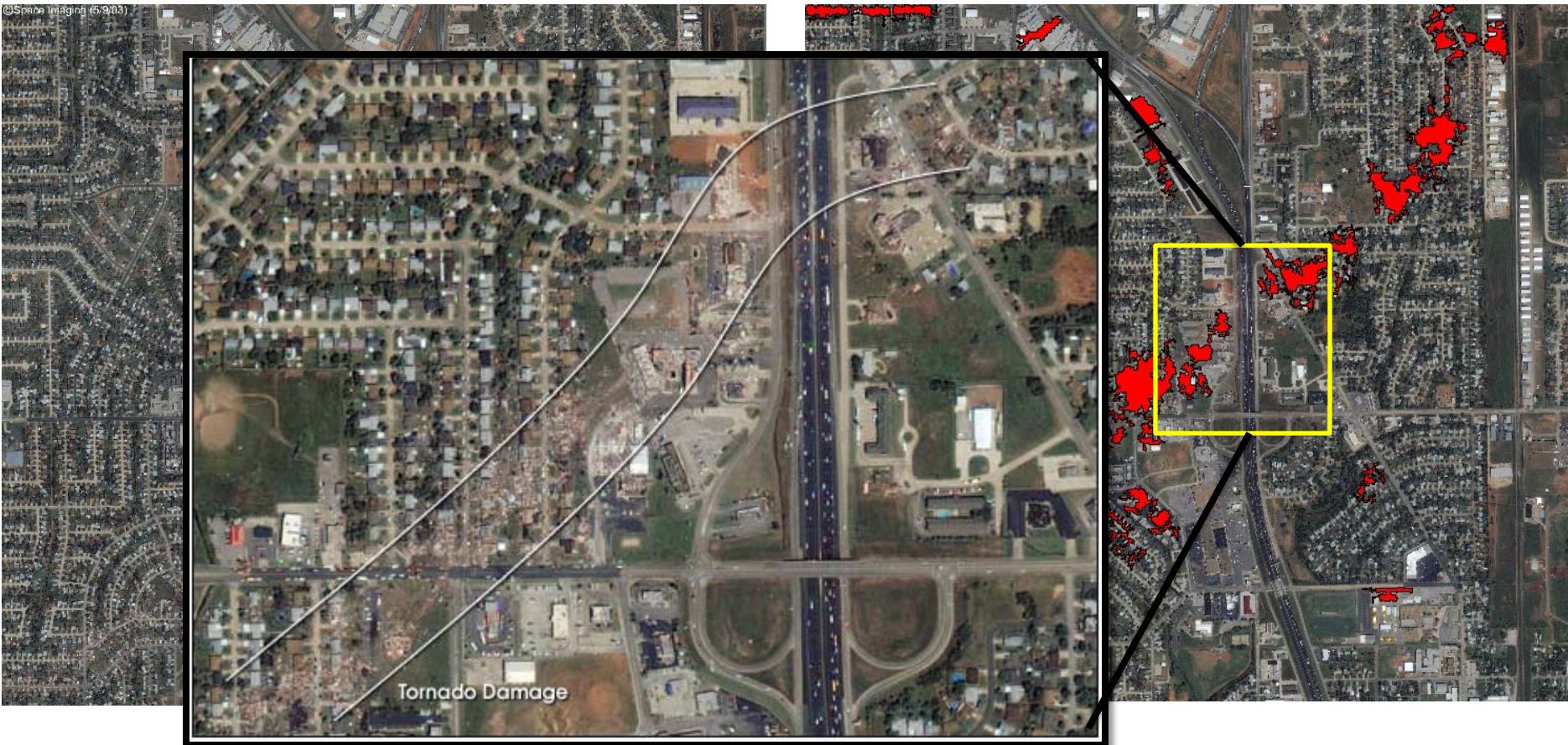
US Tornado 1999



**Image Courtesy:** (Image courtesy: Geo eye, source:  
<http://earthobservatory.nasa.gov/NaturalHazards/view.php?id=11470>)<sup>26</sup>



# MOORE, OKLAHOMA, US TORNADO SATELLITE IMAGERY (1m/pixel)



**Image Courtesy:** (Image courtesy: Geo eye, source:  
<http://earthobservatory.nasa.gov/NaturalHazards/view.php?id=11470>)<sup>27</sup>



# TUSCALOOSA , ALABAMA, TORNADO

## SATELLITE IMAGERY (30m/pixel)

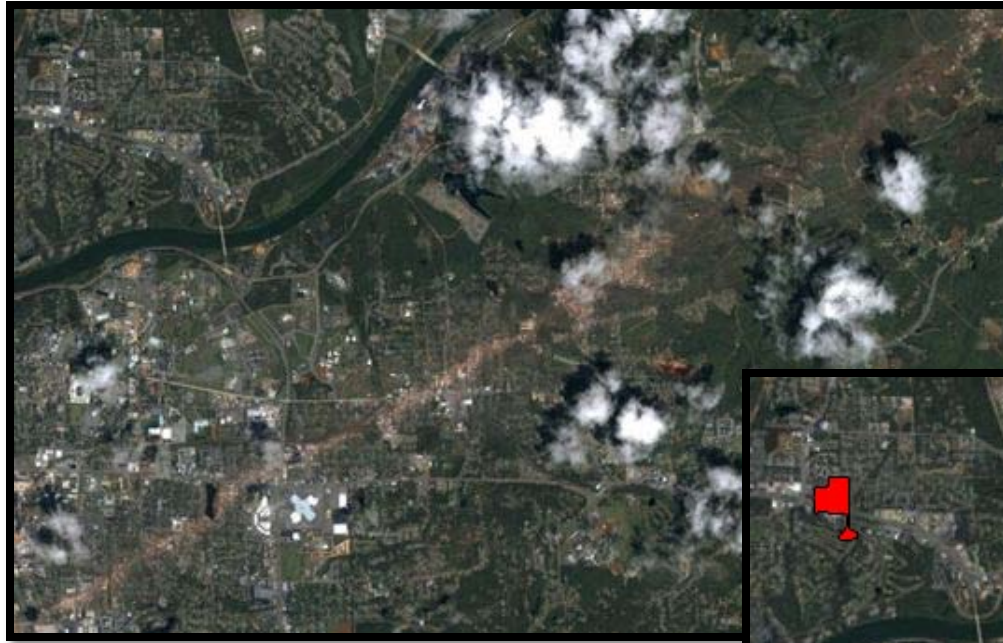
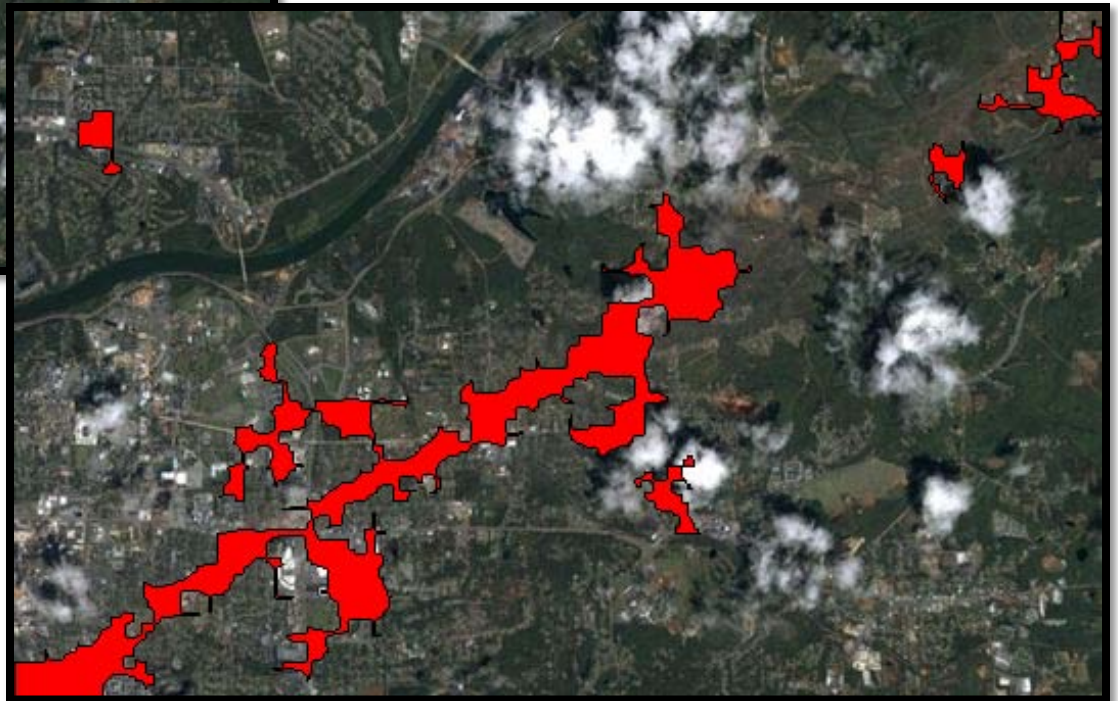


Image Courtesy: Google/Geo eye

US Tornado 2011





# TOKUNOSHIMA, KAGOSHIMA TORNADO

## AERIAL IMAGERY



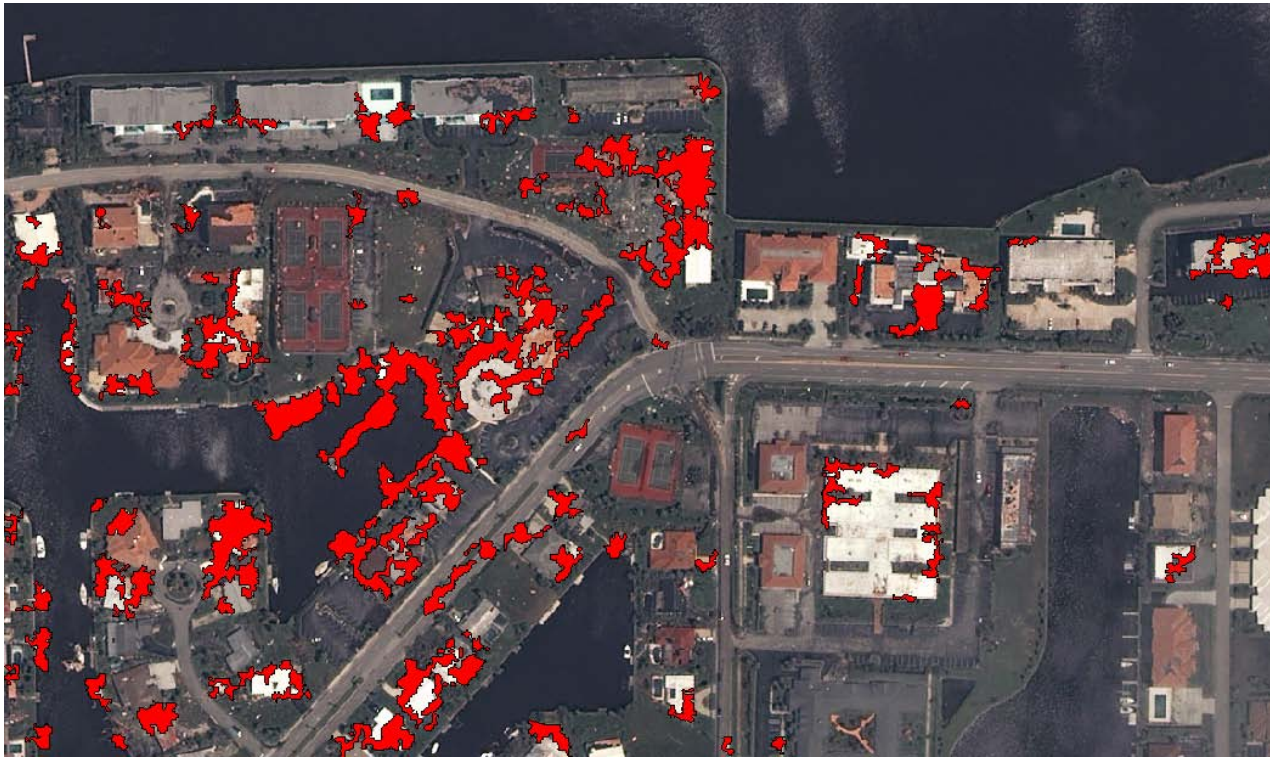
Image Courtesy: very low resolution image capture from a video taken by **Asahi Shimbun**

Japan Tornado Nov19, 2011



# PUNTA GORDA : HURRICANE CHARLEY

## Satellite image (2.44m/pixel)

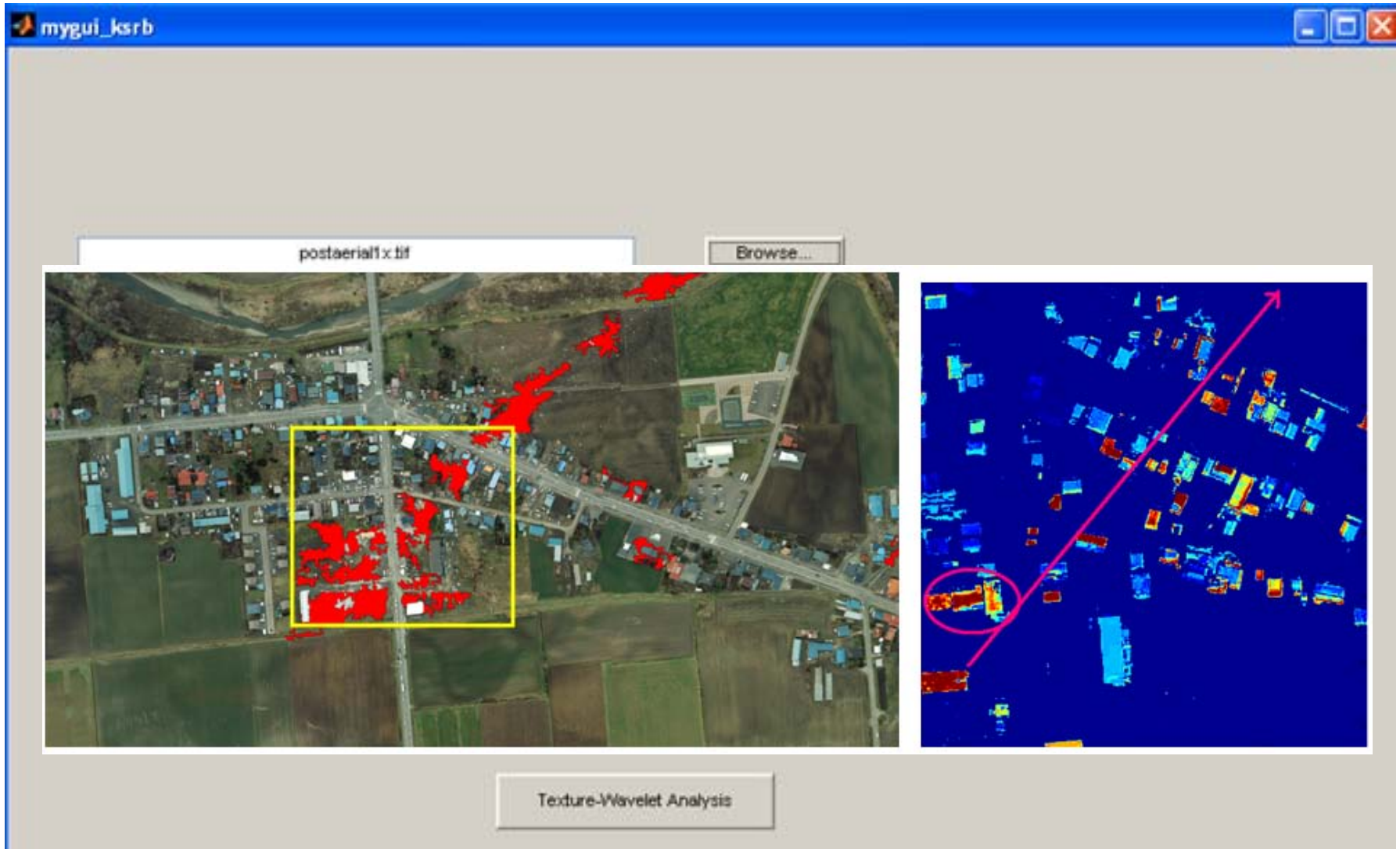


US Hurricane Aug  
13<sup>th</sup> 2004

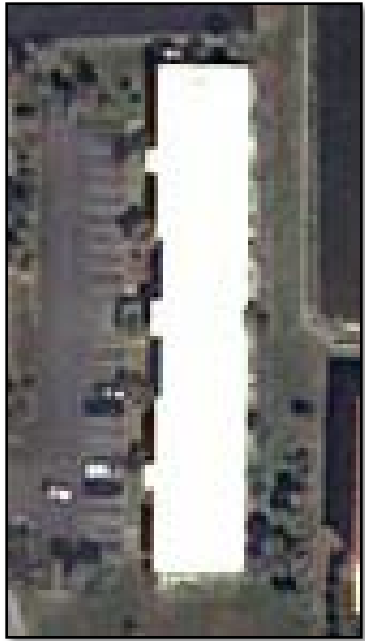
Image Courtesy: [DigitalGlobe<sub>TM</sub>](#) and were licensed and provided by [Remote Sensing Technology Center of Japan \(RESTEC\)](#)



# SOFTWARE DESIGNED



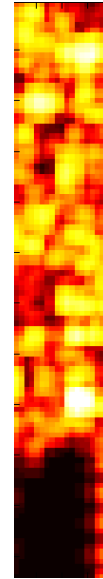
# USAGE OF HIGH RESOLUTION IMAGERY FOR BUILDING DAMAGE DETECTION



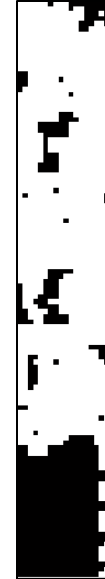
**Pre –storm  
Roof Top**



**Post-storm  
Roof Top**



**Damage  
Severity**



**Damaged  
Area Detected**

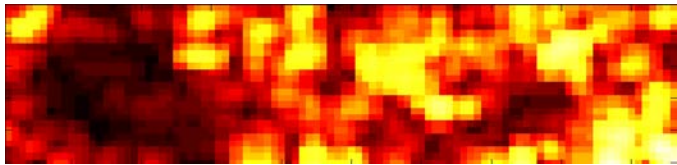
# **USAGE OF HIGH RESOLUTION IMAGERY FOR BUILDING DAMAGE DETECTION**



**Pre -storm Roof Top**



**Post-storm Roof Top**



**Damage Severity**



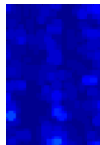
**Damaged Area Detected**

# USAGE OF HIGH RESOLUTION IMAGERY FOR BUILDING DAMAGE DETECTION

Post-storm  
Roof Top



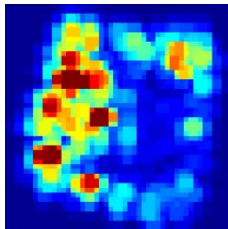
Damage  
Severity



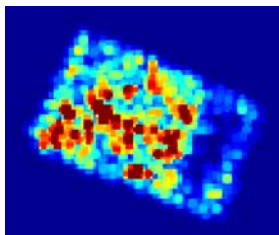
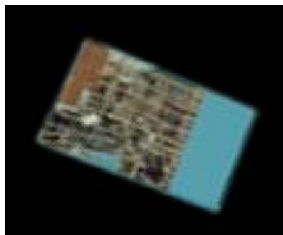
Damage area  
Detected



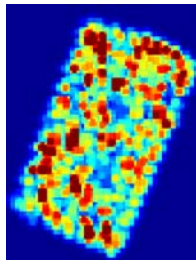
**% Area of Roof Damage = 0%**



**% Area of Roof Damage = 41%**



**% Area of Roof Damage = 58%**



**% Area of Roof Damage = 89%**

# **OTHER NATURAL HAZARDS DETECTED FROM SATELLITE IMAGERY**



# THAILAND FLOOD

## Satellite image 10m/pixel



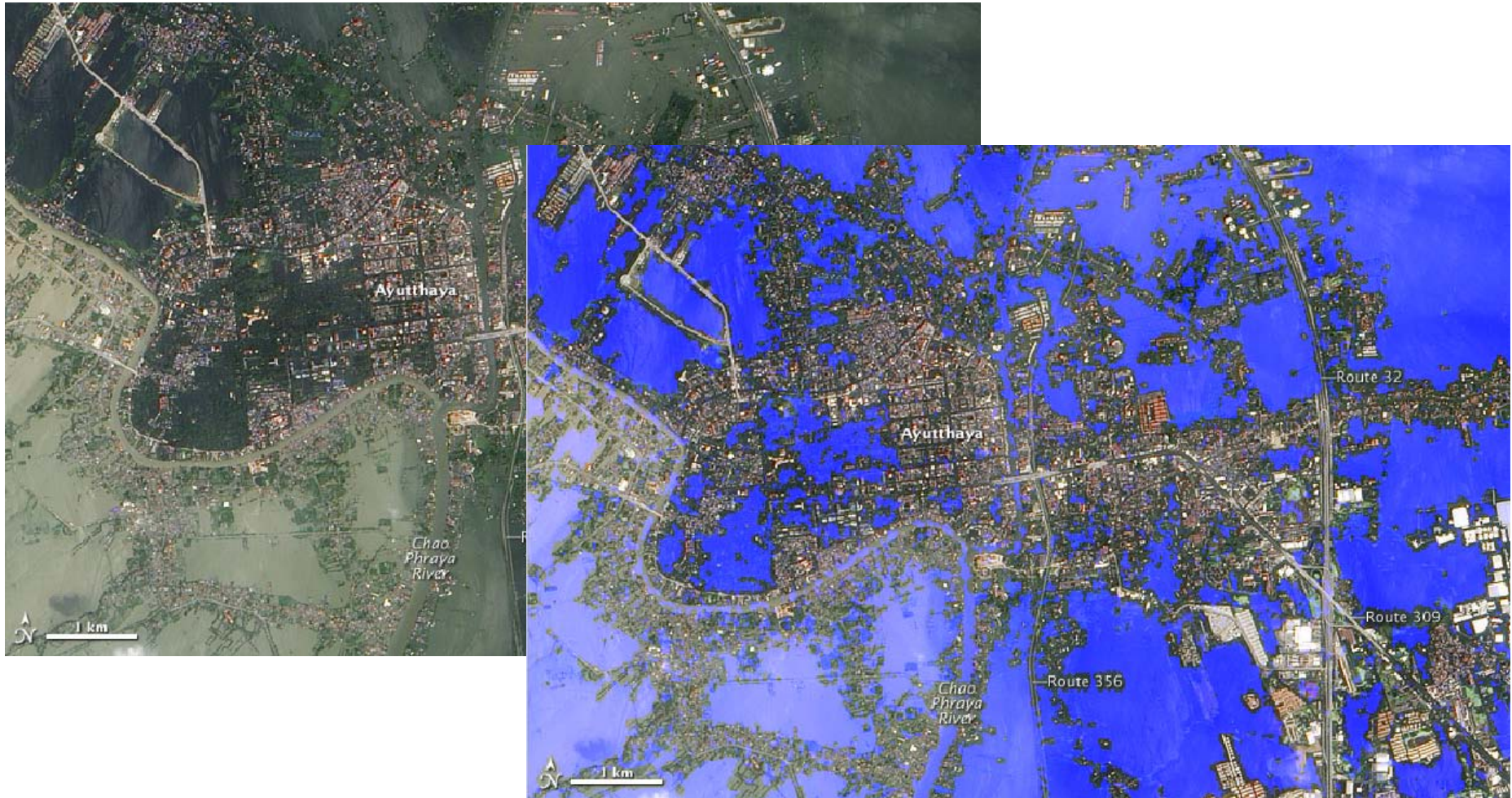
Ayutthaya, Bangkok, DATE: OCT 23, 2011

Image Courtesy: EarthObservatory, NASA



# THAILAND FLOOD

## Satellite image 10m/pixel



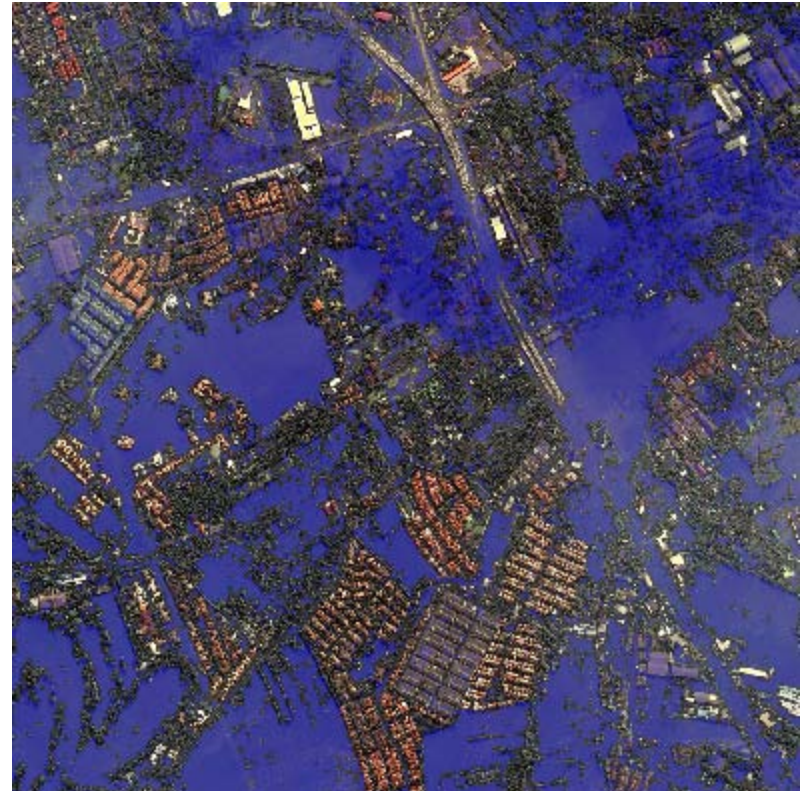
**Ayutthaya, Bangkok, DATE: OCT 23, 2011**

**Image Courtesy:** EarthObservatory, NASA



# THAILAND FLOOD

## Satellite image 2.44m/pixel



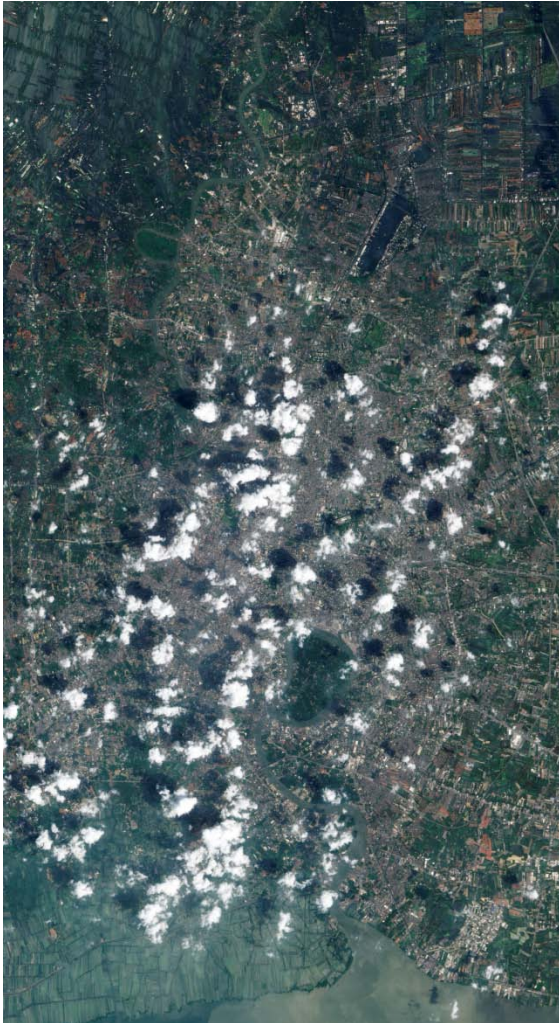
Bangkok, DATE: OCT 25, 2011

Image Courtesy: EarthObservatory, NASA



# THAILAND FLOOD

Satellite image 20m/pixel



Bangkok DATE: OCT 31, 2011

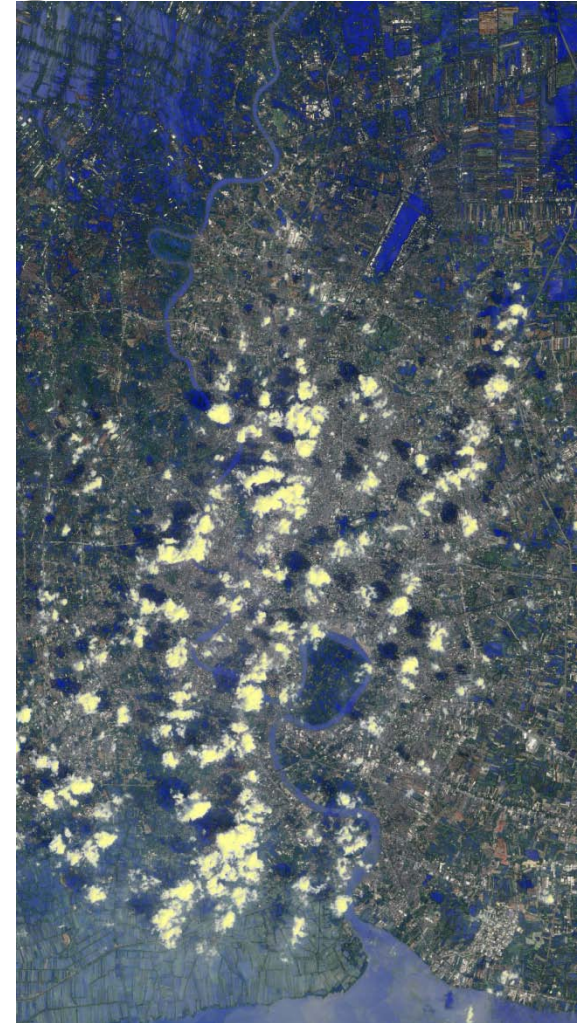
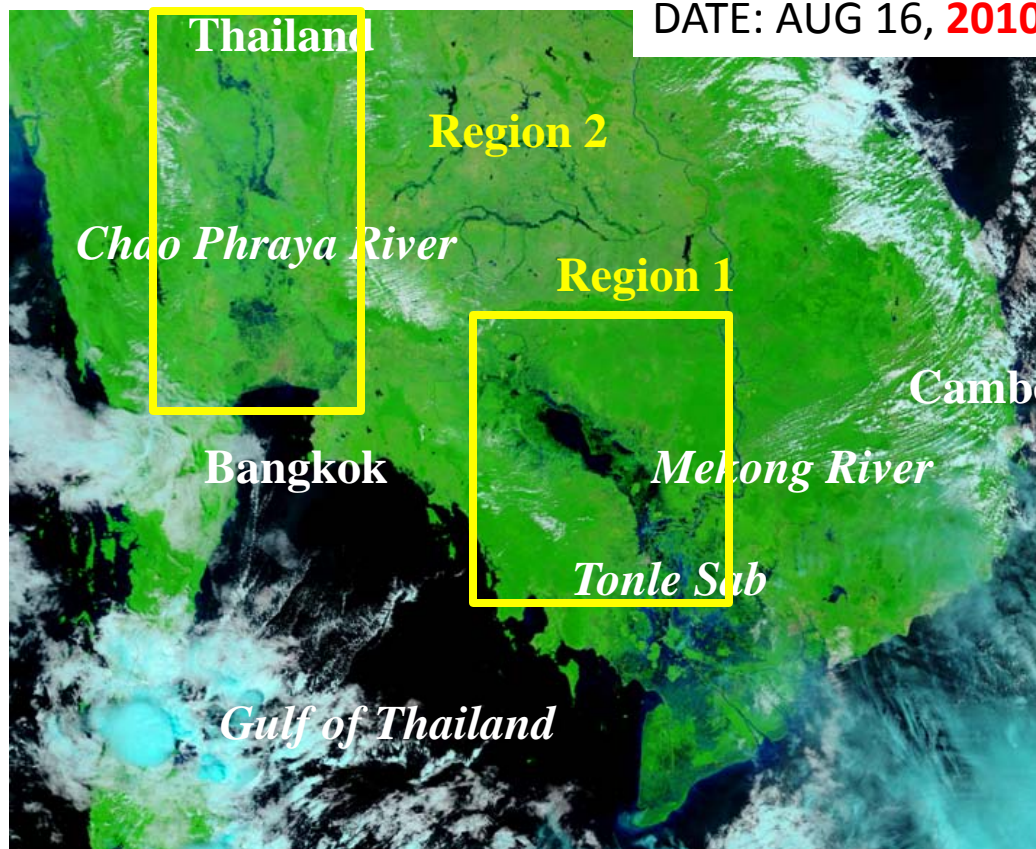


Image Courtesy: EarthObservatory, NASA



# THAILAND FLOOD



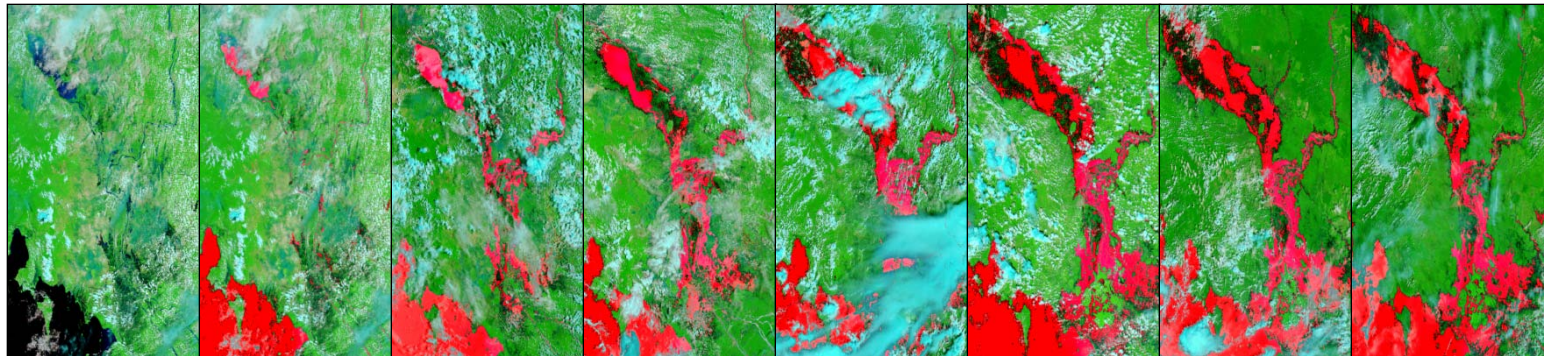
- Moderate Resolution Imaging Spectroradiometer
- combination of visible and infrared light to better distinguish between water and land

Image Courtesy: EarthObservatory, NASA



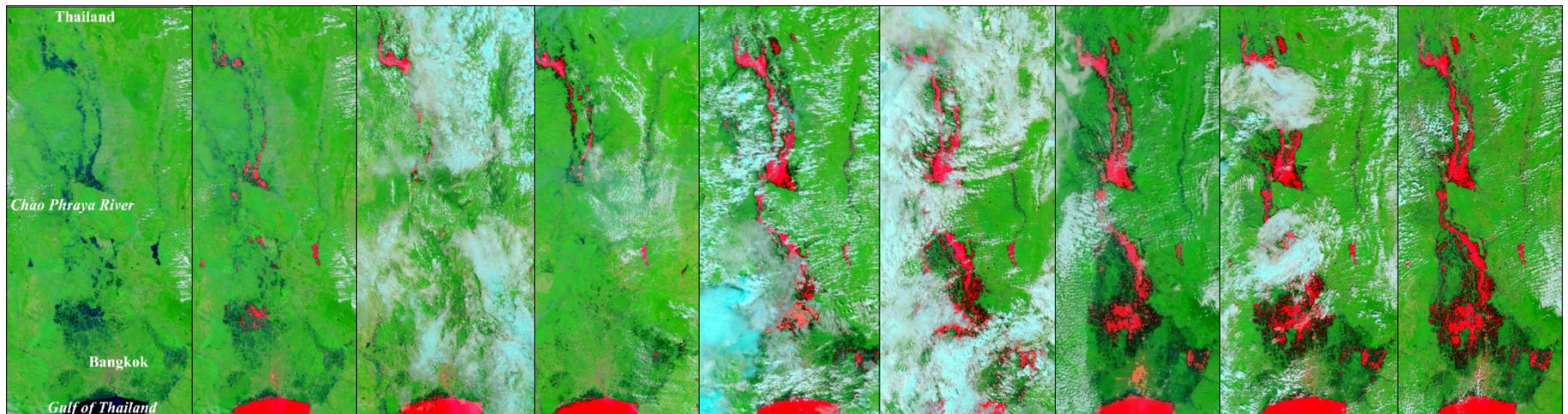
# PROGRESS IN THAILAND FLOOD

*Region 1* → CAMBODIA



AUG 16 2010    AUG 16 2010    AUG 13 2011    AUG 24 2011    OCT 11 2011    OCT 18 2011    OCT 25 2011    NOV 1 2011

*Region 2* → BANGKOK



AUG 16 2010    AUG 16 2010    AUG 13 2011    AUG 24 2011    OCT 11 2011    OCT 18 2011    OCT 19 2011    OCT 25 2011    NOV 1 2011





In search of Satellite images

# DEBRIS OF JAPAN TSUNAMI IN PACIFIC OCEAN



Image Courtesy: US Navy in Japan



# CONCLUSIONS

1. Tornado foot prints are traced successfully by using Texture-Wavelet Analysis from the debris deposit using post-storm image alone
2. User friendly software is designed for the purpose.
3. Further, once the path is traced **Where exactly building damage is located** can be easily traced

# ACKNOWLEDGEMENTS

- The authors would like to extend their gratitude to the **Saroma-cho local Government** for providing the aerial imageries of Saroma-cho
- This study was funded by **MEXT, Japan**, through the **Global Center of Excellence Program, 2008-2012**, which is gratefully acknowledged.

**THANK YOU VERY MUCH  
FOR YOUR  
KIND ATTENTION**

