

Assessment of Flooded Areas Using Spectral Mixture Analysis from Satellite Optical Images and Relationship between Water Occupancy and Backscattering Coefficient of SAR

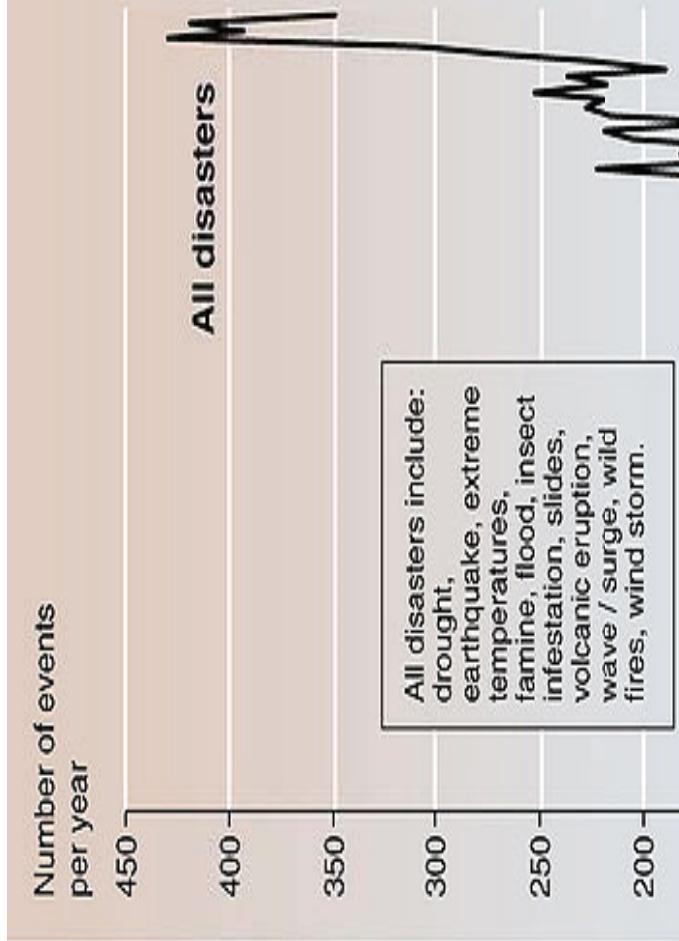
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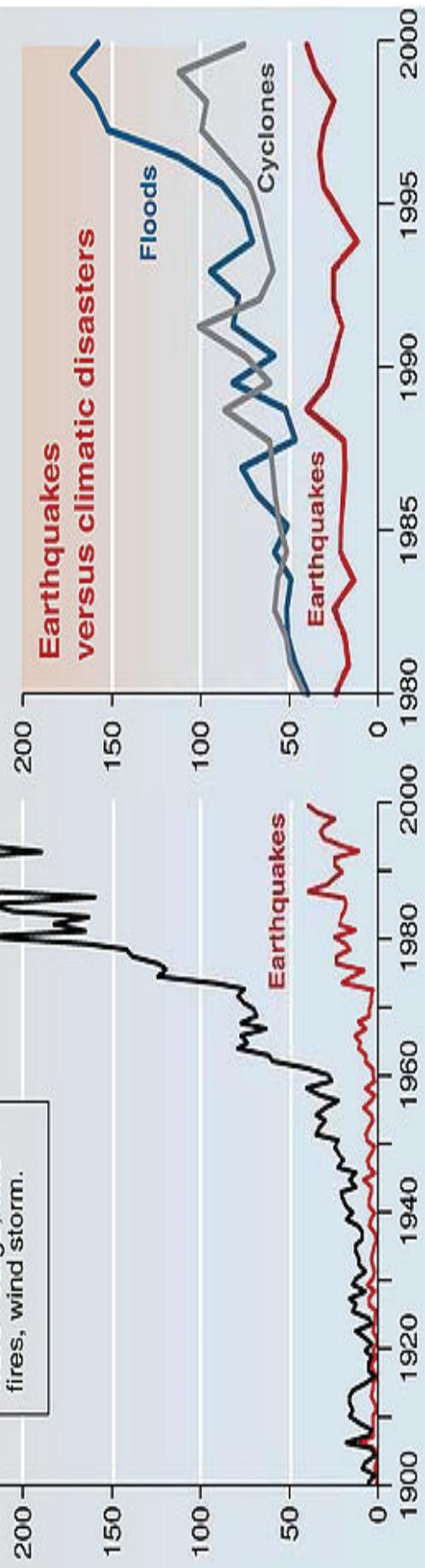
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Disaster Trend



Much of the increase in the number of hazardous events reported is probably due to significant improvements in information access and also to population growth, but the number of floods and cyclones being reported is still rising compared to earthquakes. How, we must ask, is global warming affecting the frequency of natural hazards?



Source:

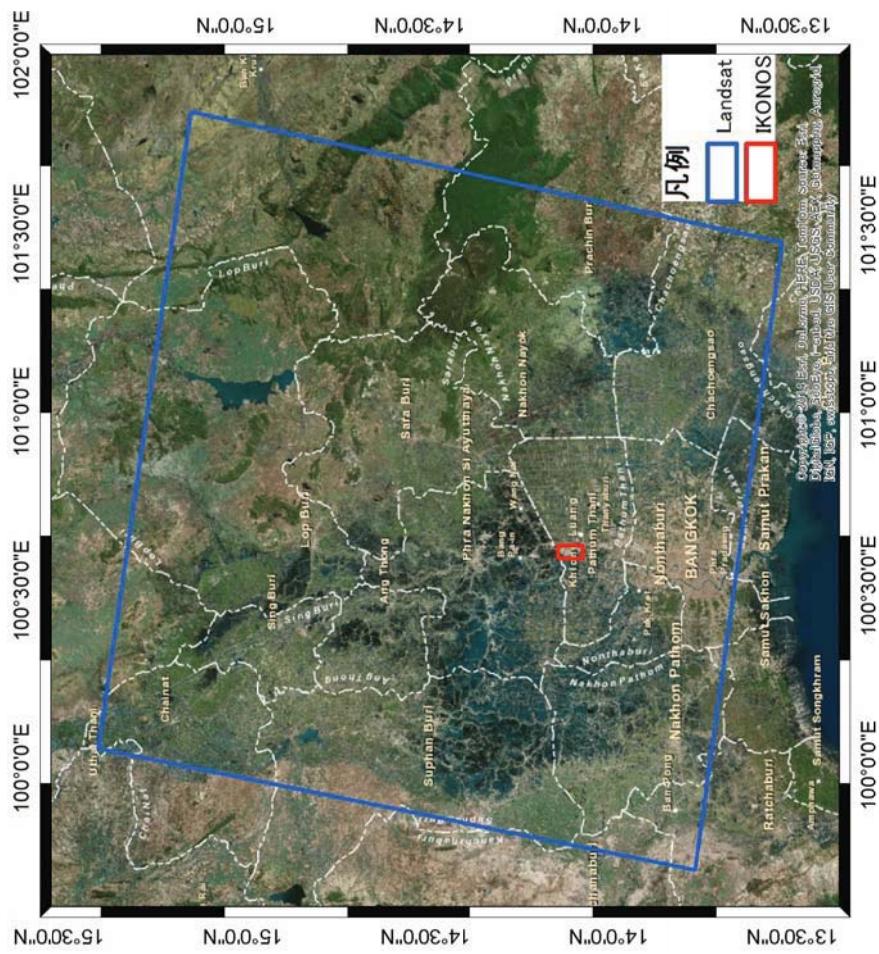
Dr. Seree Supratid (Rangsit Univ)

Purpose of This Study

- In order to detect the damages due to flood or tsunami, we assess the flood damage by calculating water occupancy in each pixel of optical satellite images such as Landsat-7 ETM+ reflectance dataset using Spectral Mixture Analysis (SMA).
- Firstly, we validate the method of SMA in case of the 2011 flood event in Bangkok, Thailand, comparing the result of SMA and visual interpretation from IKONOS image.
- Secondary, we apply SMA to Landsat-7 image observed the 2011 Tohoku earthquake tsunami to detect the inundated areas.
- Additionally, we develop an estimation model for calculating the water occupancy based on satellite SAR observation, comparing the SMA result and backscattering coefficients of the ALOS PALSAR images.
- Finally, we compare backscattering coefficients among ALOS PALSAR, Envisat ASAR, and TerraSAR-X images in terms of water occupancy estimation.

Spectral Mixture Analysis (SMA) and Application to the 2011 Thailand Flood

The 2011 Thailand Flood



Landsat-7 ETM+ Image

(USGS Landsat CDR Reflectance)

Observation: Nov. 18, 2011 (flooding)

Spatial resolution: 30m

Band used: 1,2,3,4,5,7

Mask layers: sea, cloud, cloud shadow

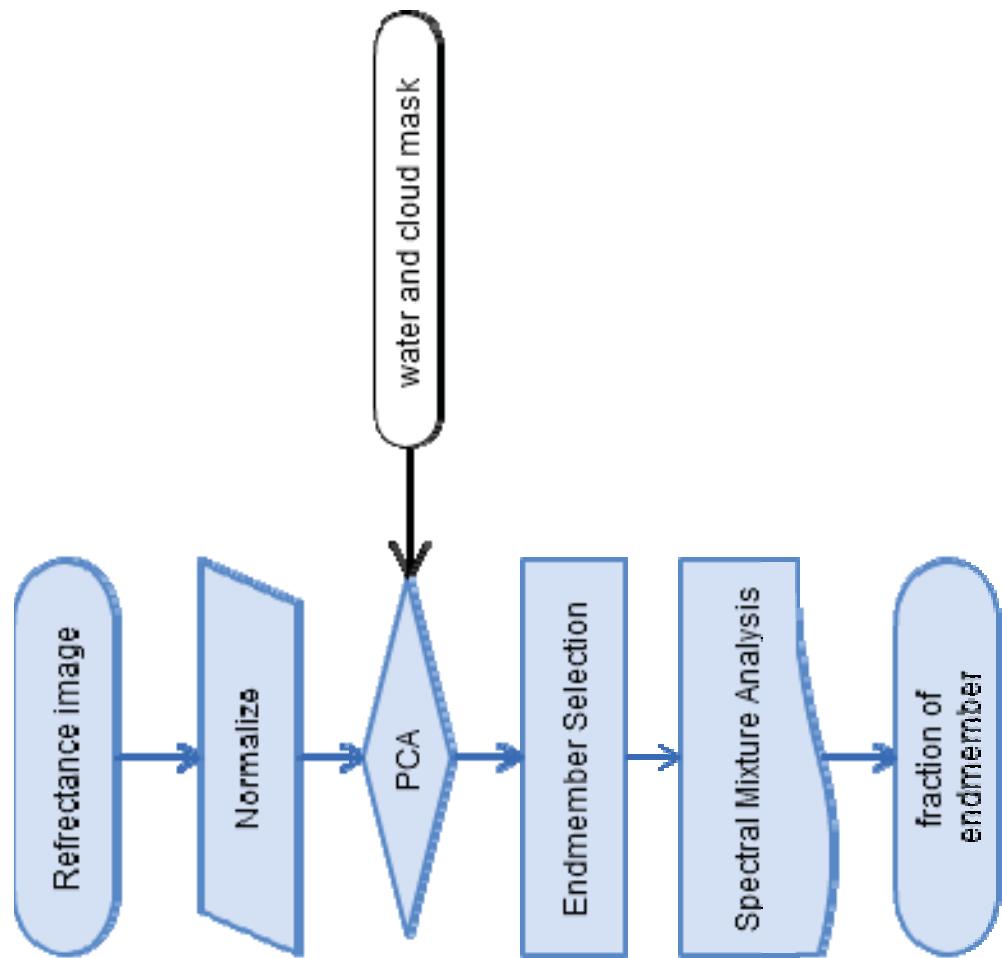
※ Images have black (null) stripes
after the scan line corrector failure on
May 31, 2003.

IKONOS Image (for validation)

Observation: Nov. 17, 2011

Spatial resolution: 50 cm

Spectral Mixture Analysis (SMA)



The aim of SMA
→ resolving the MIXEL
problems for coarse
resolution imagery

SMA approach is based on the
assumption, which the
observed spectrum is a linear
combination of the spectral of
all endmembers in a pixel.

Spectral proportions of the
components represented the
rate of the surface features.

Flowchart of SMA method

Normalize Process

To suppress illumination effects and albedo variations, normalize process was parried followed by equations (1) and (2) (Xianfeng and Li, 2008).

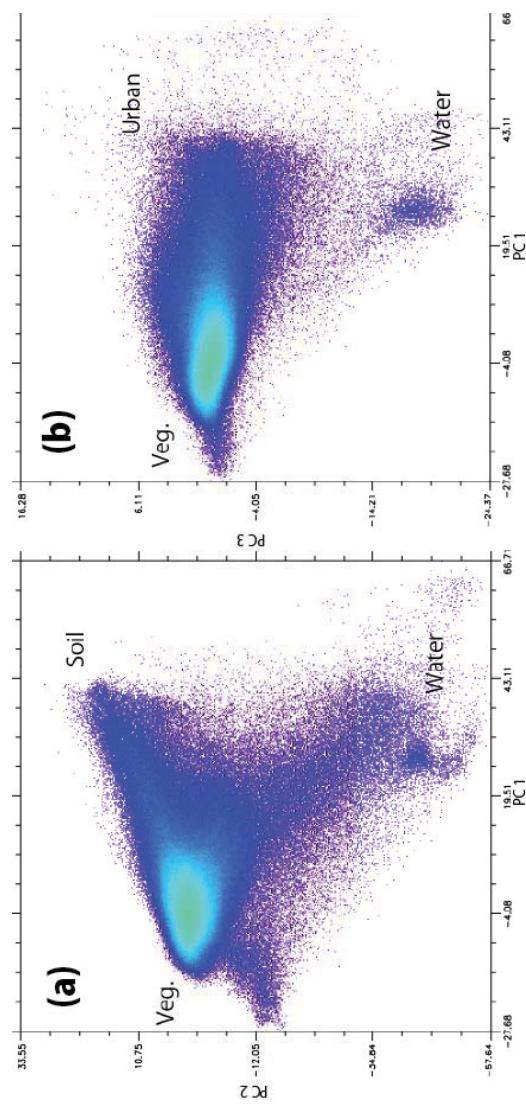
$$R = \sqrt{\sum_{b=1}^N R_b^2} \quad (1)$$

Where

$$\begin{aligned} R_b &: \text{original reflectance for band } b \\ N &: \text{total number of bands} \\ R &: \text{illumination/albedo component} \\ \overline{R}_b &= \frac{R_b}{R} \times 100 \quad (2) \end{aligned}$$

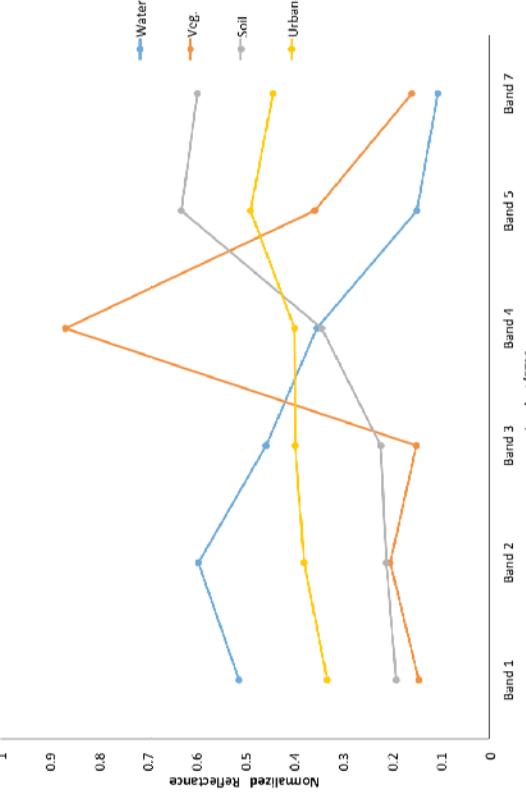
\overline{R}_b : normalized reflectance value for band b in a pixel

Endmember Selection



Feature space representation of the first 3-PC
(a) PC1 vs. PC2, (b) PC1 vs. PC3.

Averaged reflectance spectra
of four endmembers



Endmembers were selected from the normalized Landsat/ETM+ reflectance based on the principal component analysis (PCA) method. The locations of the pixel clusters on the normalized reflectance image, **water**, **forest (vegetation)**, **soil**, and **urban** were interpreted and identified for endmembers.

The Linear Model for SMA (Wu and Murray, 2003)

A linear spectral mixture analysis model is adopted in this study.
For a given pixel, the normalized reflectance for each band b in the Landsat-7 ETM+ image can be written as Eq (3)

Where

$$\overline{R}_b = \sum_{i=1}^N \bar{f}_i \times \overline{R}_{i,b} + e_b \quad (3)$$

Where

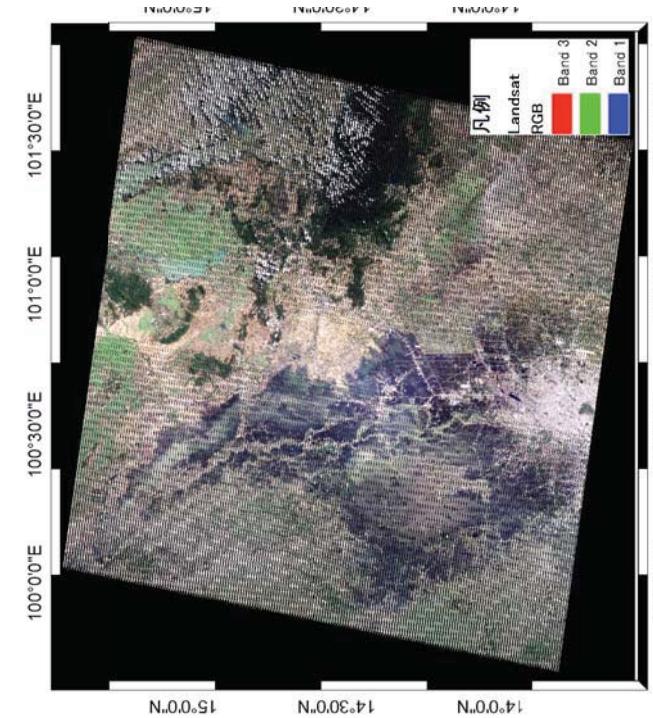
- \overline{R}_b : normalized reflectance value for each band b in a pixel
- $\overline{R}_{i,b}$: endmember i in band b for the pixel
- \bar{f}_i : fraction of endmember i
- e_b : residual

The fraction of each endmember in a pixel can be calculated using a least squares method in which the residual is minimized. And Eq (4) is required.

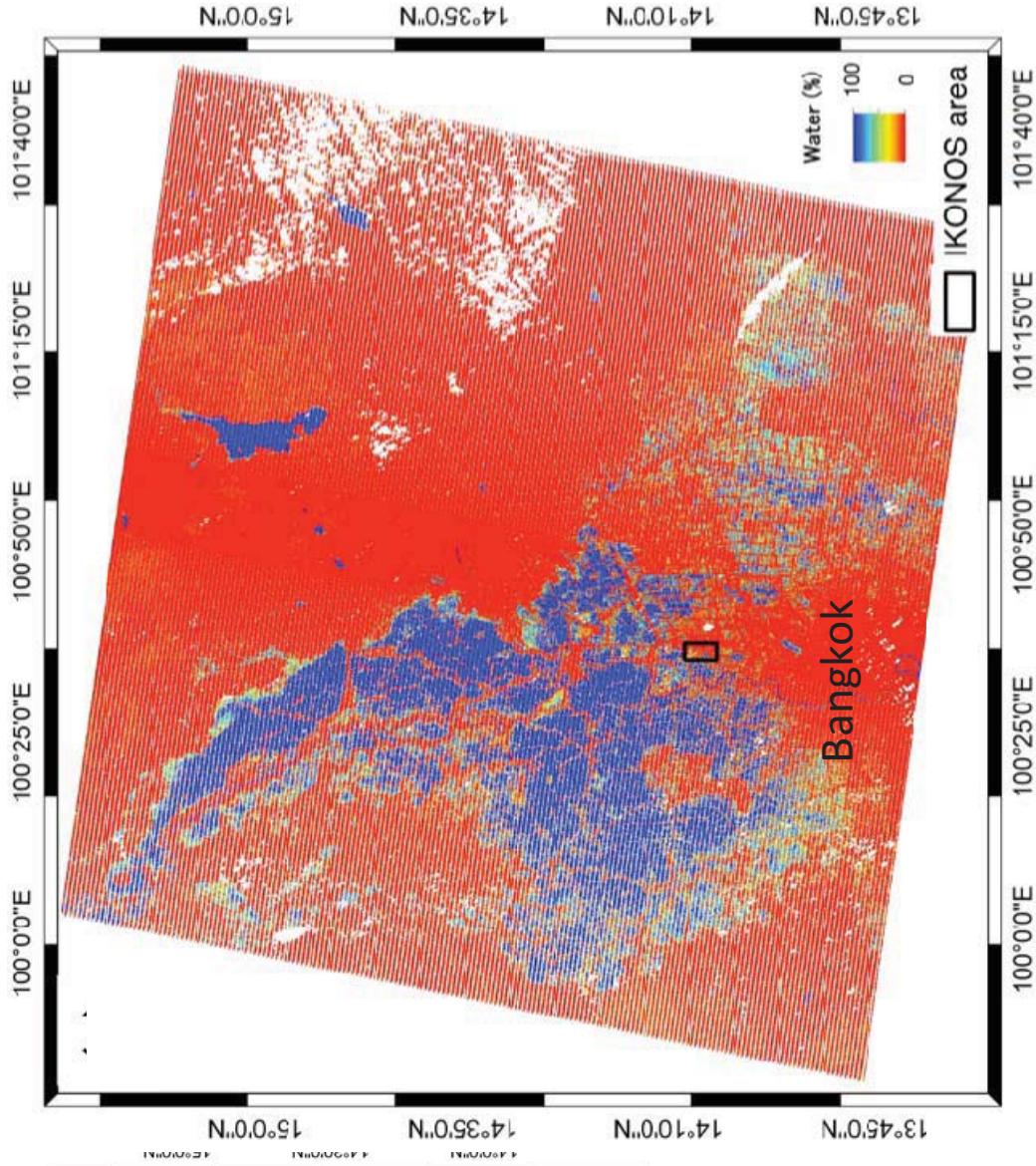
$$\sum_{i=1}^N \bar{f}_i = 1 \quad \text{and} \quad 1 \geq \bar{f}_i \geq 0 \quad (4)$$

SMA Result

- Water Occupancy Distribution -

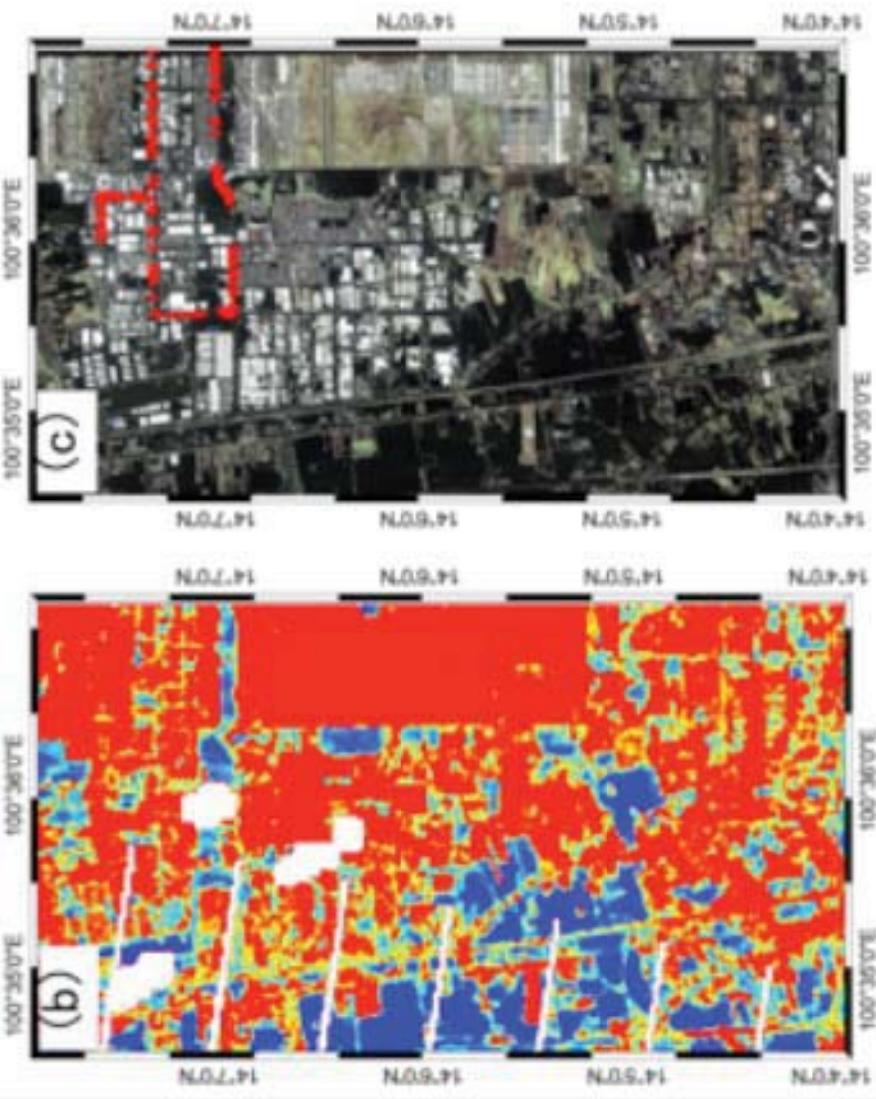


Original Landsat-7 Image



Flooded areas range widely
in the north region of
Bangkok.

Validation of SMA Result Using IKONOS Image

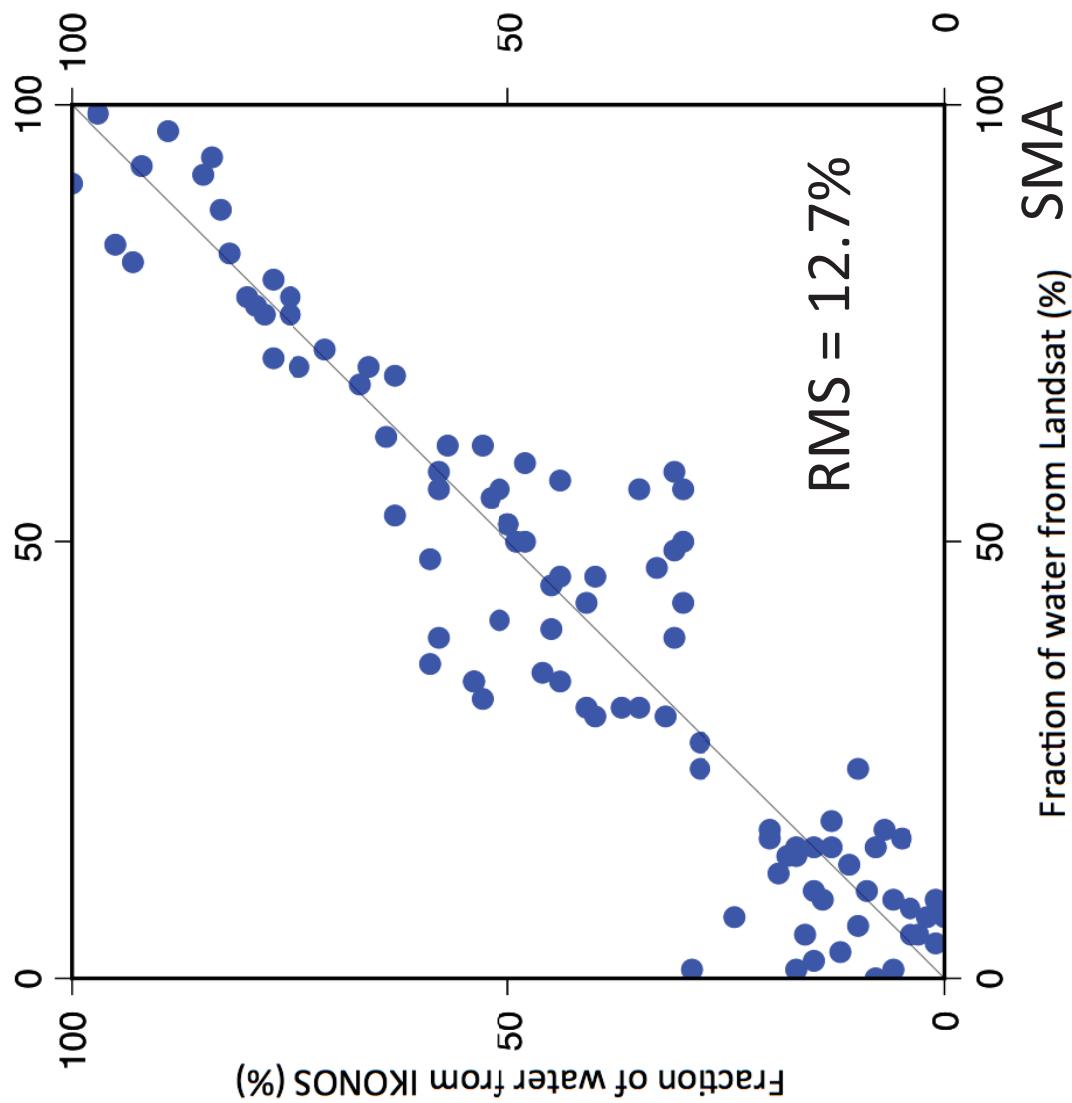


30m grids cells of Landsat pixels overlay on the IKONOS image, then identify the water occupancy of each grid cells from IKONOS by visually.

Field survey photos (Nov. 5) are also referred.

Validation of SMA Result Using IKONOS Image

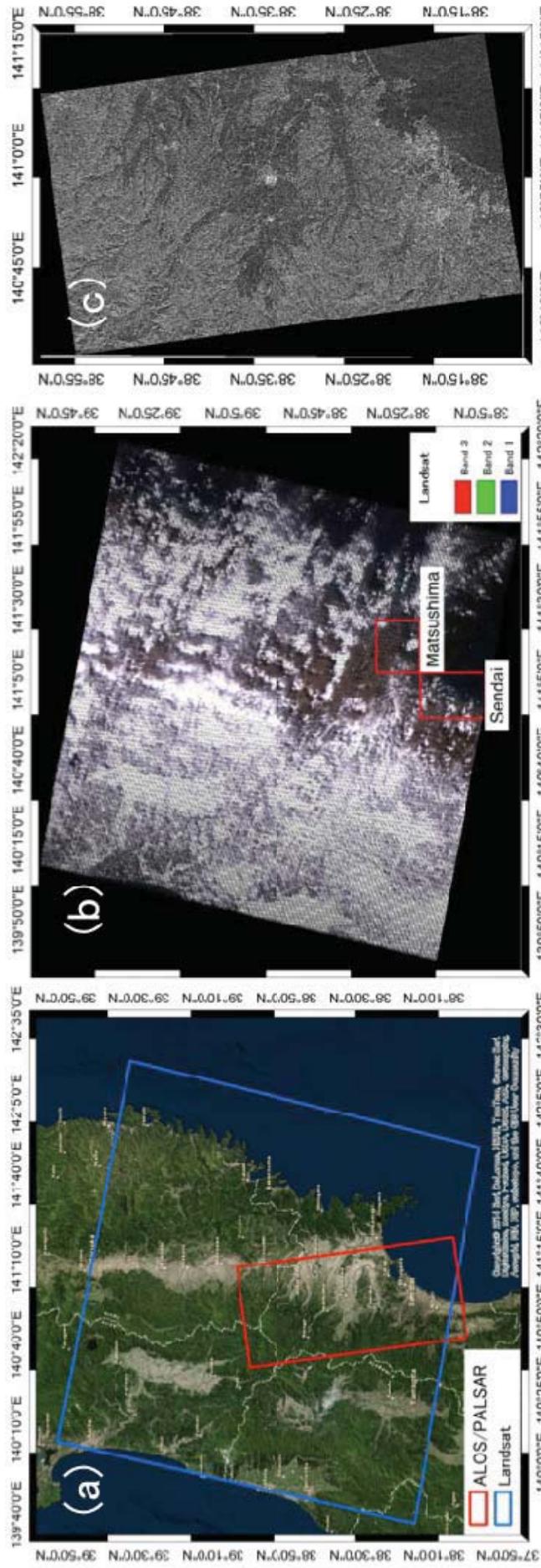
Visual Interpretation and Photos



Water Occupancy (inundation by tsunami)
vs
SAR Sigma Nought

The 2011 Tohoku Earthquake Tsunami

Landsat-7 ETM+ vs ALOS PALSAR



Landsat-7 ETM+ Image

(USGS Landsat CDR Reflectance)

Observation: Mar. 12, 2011

Spatial resolution: 30m

Band used: 1,2,3,4,5,7

Mask layers: sea, cloud, cloud shadow

ALOS PALSAR

Observation: Mar. 13, 2011

Mode: FBS (HH)

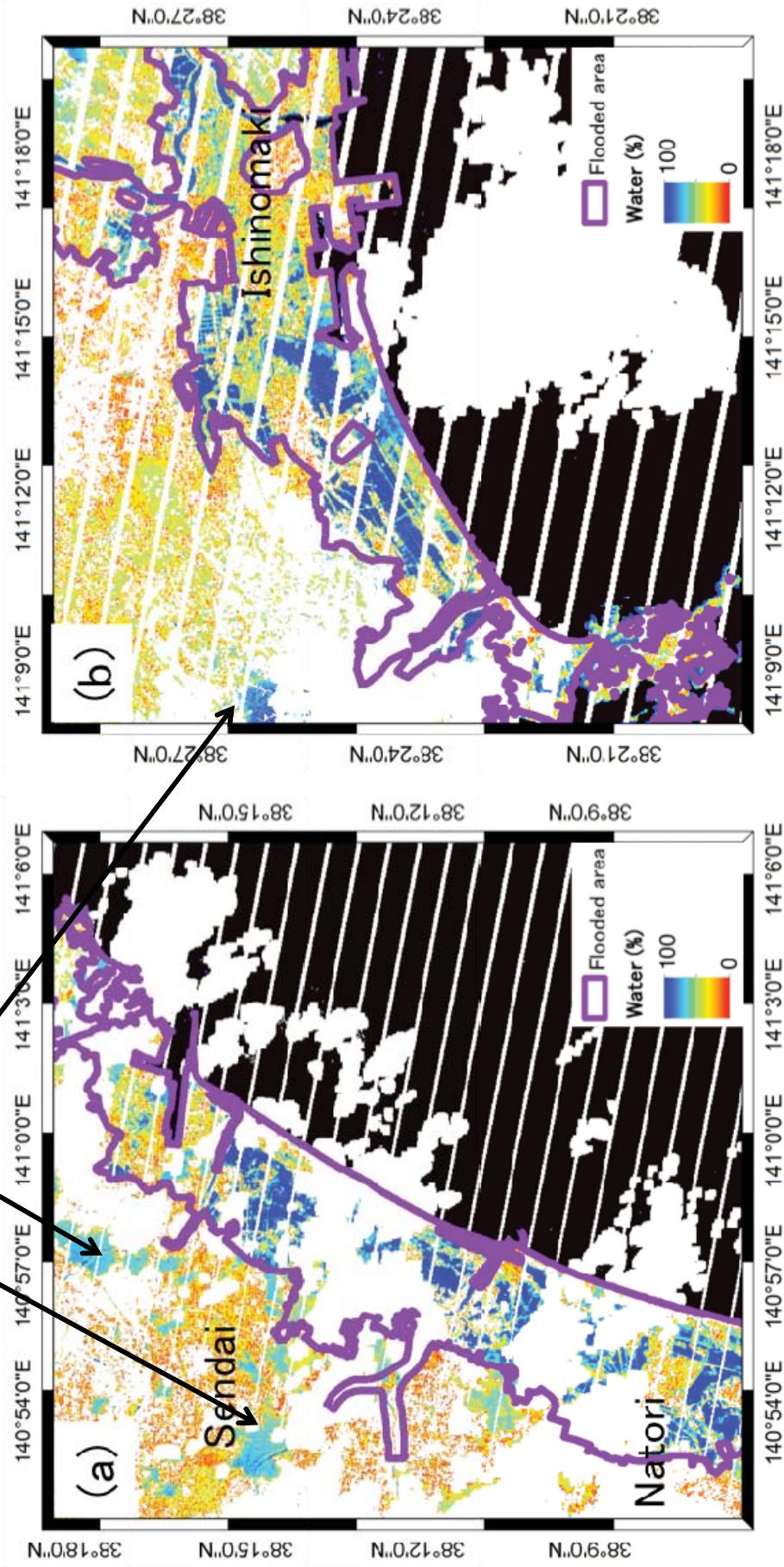
Spatial resolution: 10m

Off-nadir: 46.6°

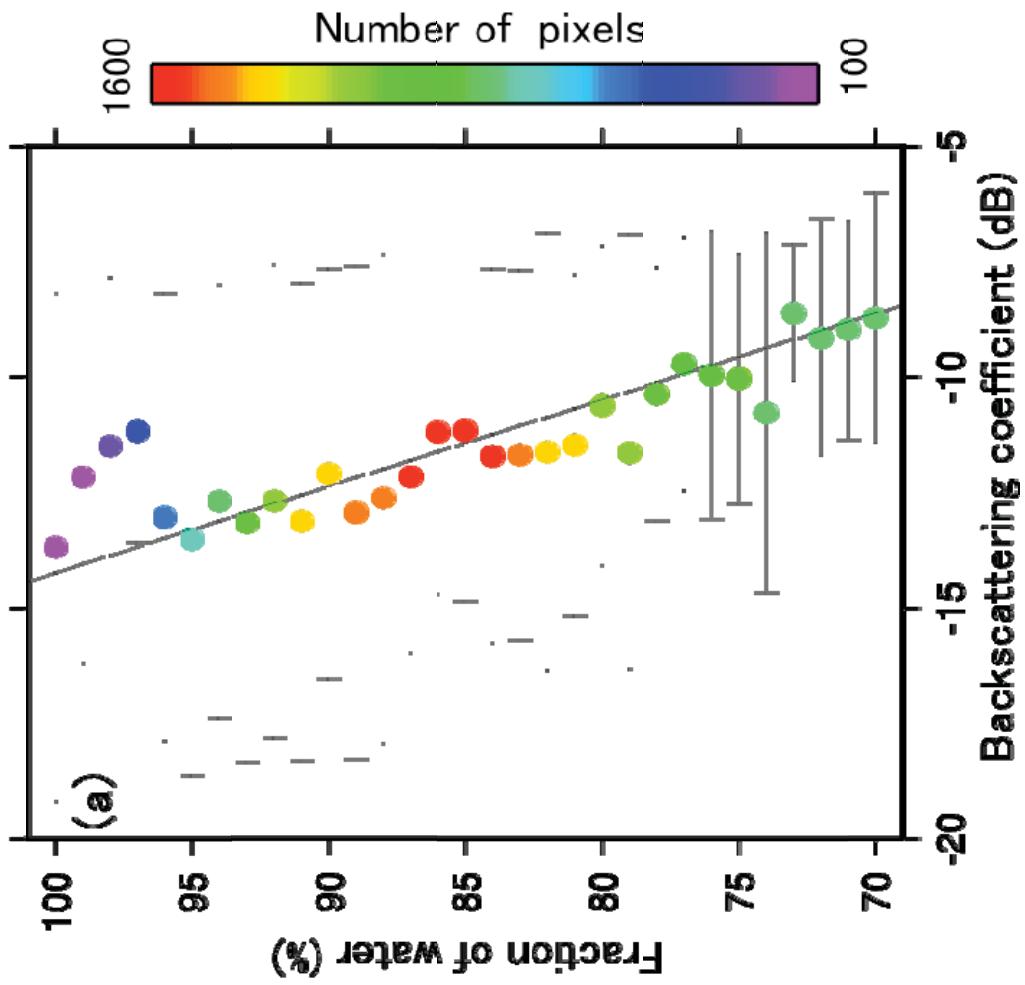
SMA Result from Landsat-7

- Water Occupancy Distribution -

Misreading by SMA (bare land? Forest?)



Relationship Between Water Occupancy and Sigma Nought of ALOS PALSAR



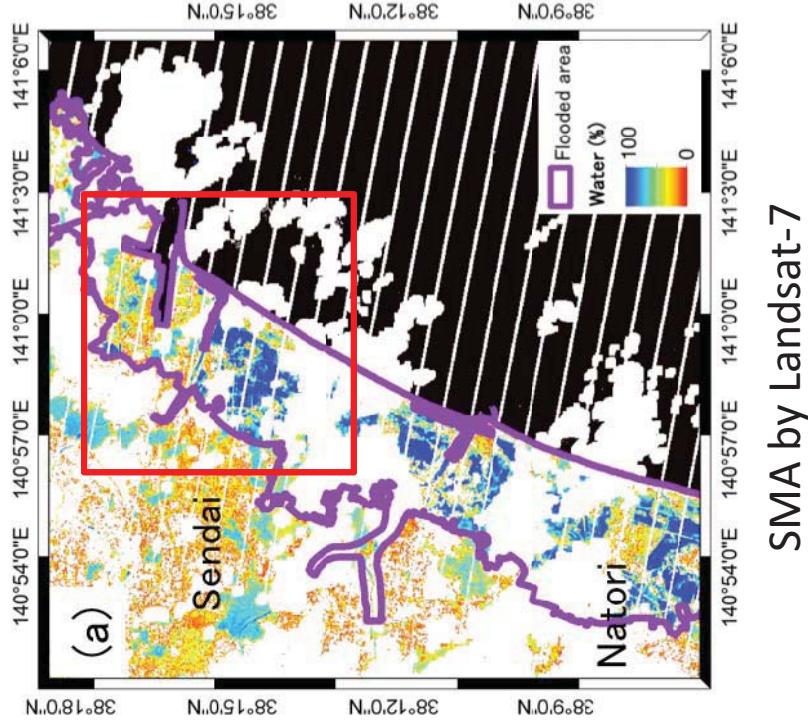
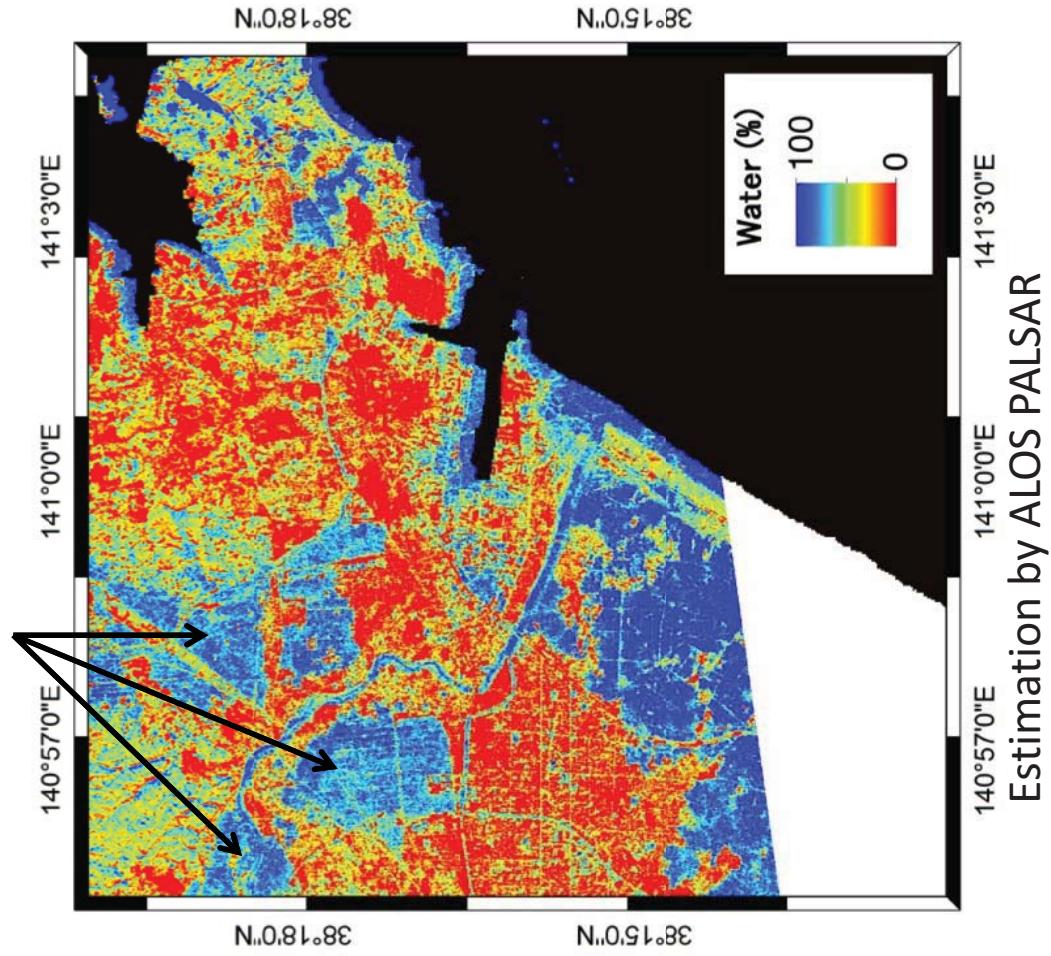
$$\text{Water} = -5.4 \times \sigma_0 - 24.0$$

Water: Fraction of water (%)

σ_0 : Backscattering coefficient (dB)

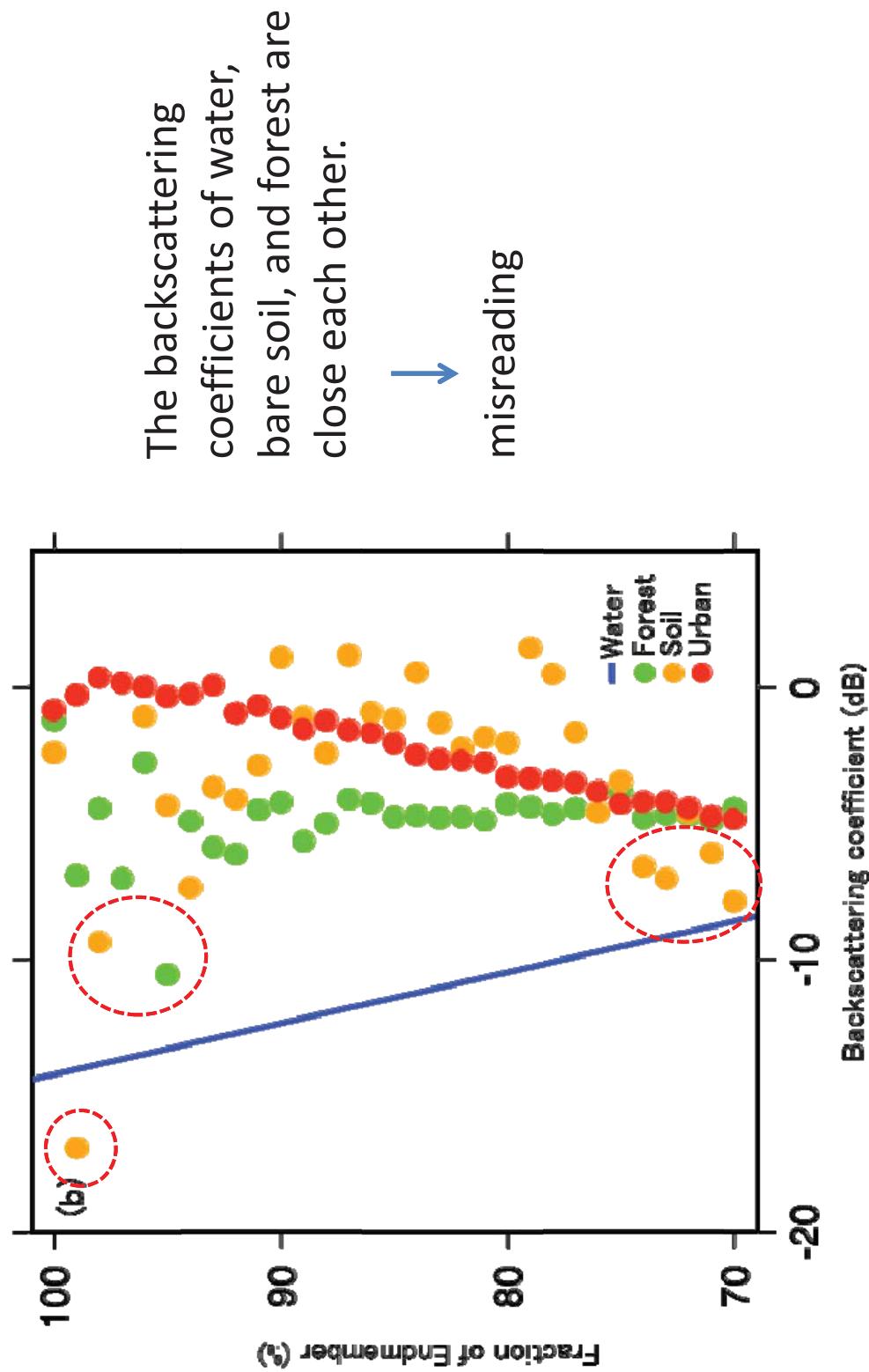
Water Occupancy Distribution from ALOS PALSAR

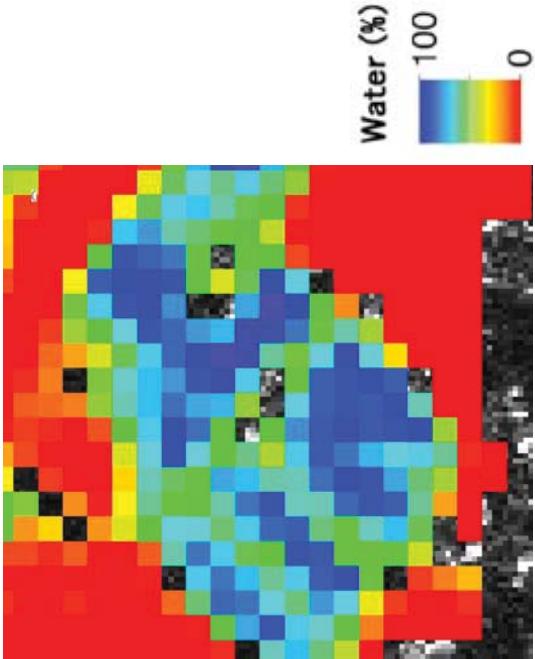
Misreading (bare land, crop field)



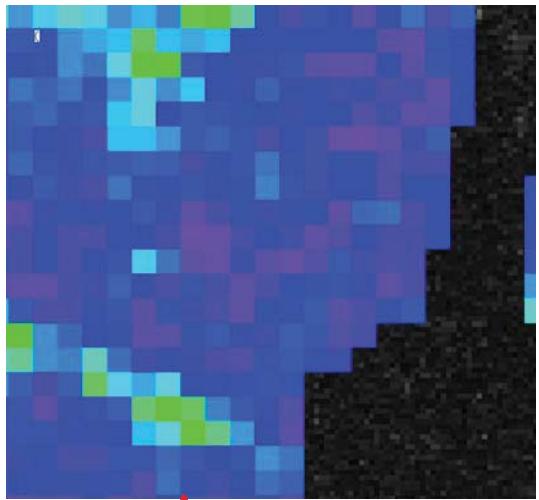
ALOS PALSAR can estimate water occupancy regardless of weather condition

Relationship Between Water Occupancy of Other Endmembers and Sigma Nought of ALOS PALSAR





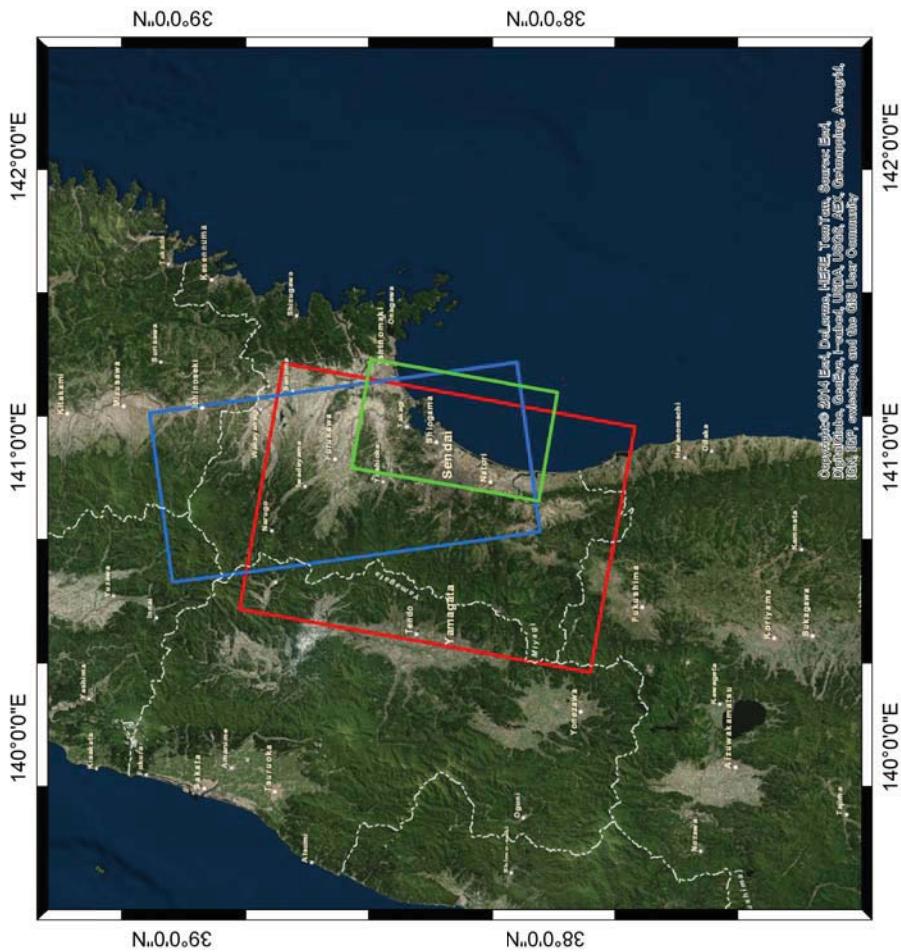
Water occupancies estimated by Landsat-7 are high though, the backscattering coefficients of the areas are high. Because there are inundated houses and debris.



ALOS PALSAR

Water Occupancy (stable water)
vs
SAR Sigma Nought

Comparison Among Sensors



Landsat-7

ALOS PALSAR:
L-band, HH
Mar. 13, 2011
Incidence angle: 43.4°

ENVISAT ASAR:
C-band, VV
Mar. 22, 2011
Incidence angle: 40.7°

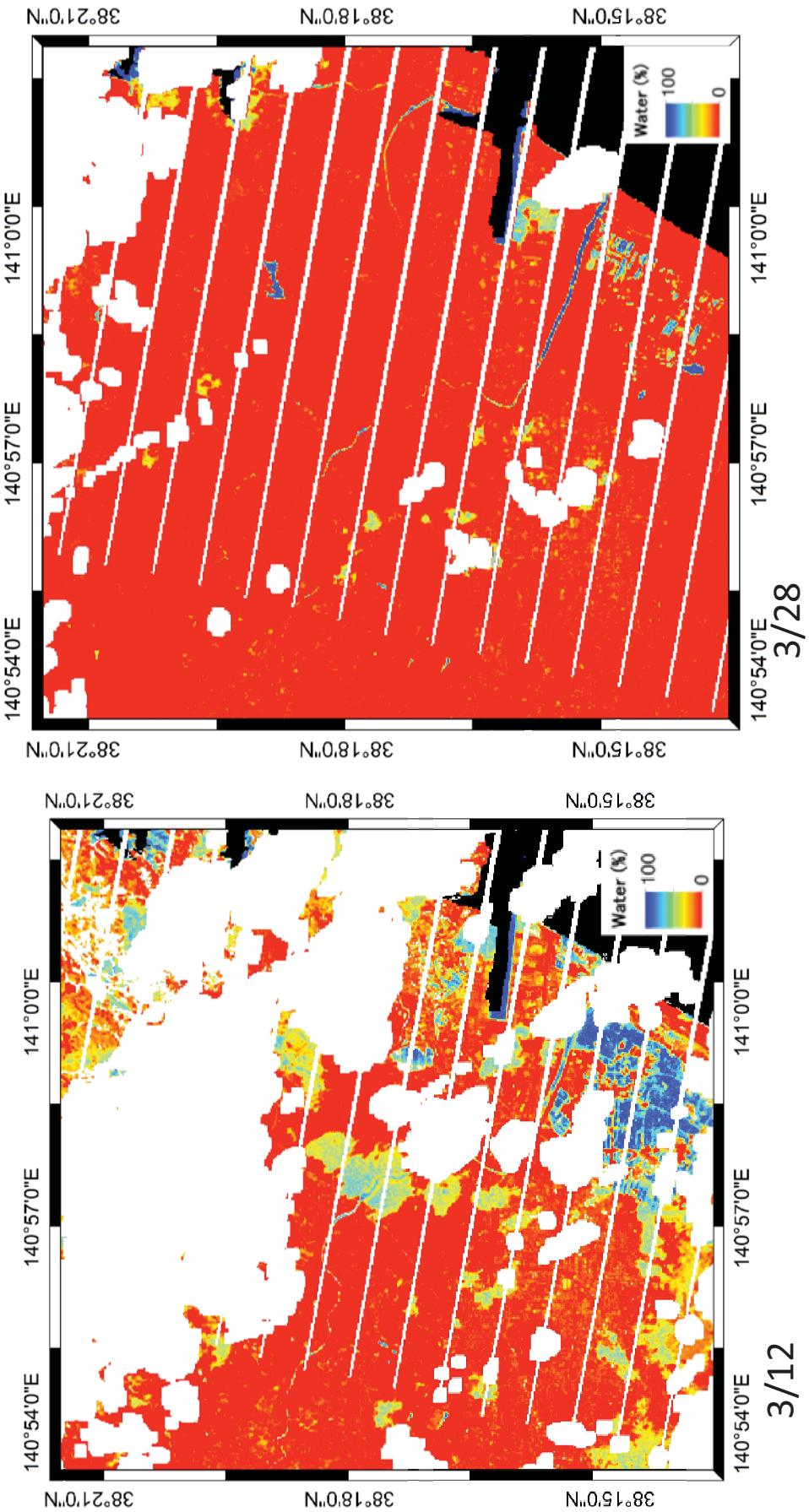
Terra SAR-X:
X-band, HH
Mar. 12, 2011
Incidence angle: 38.6°

凡例

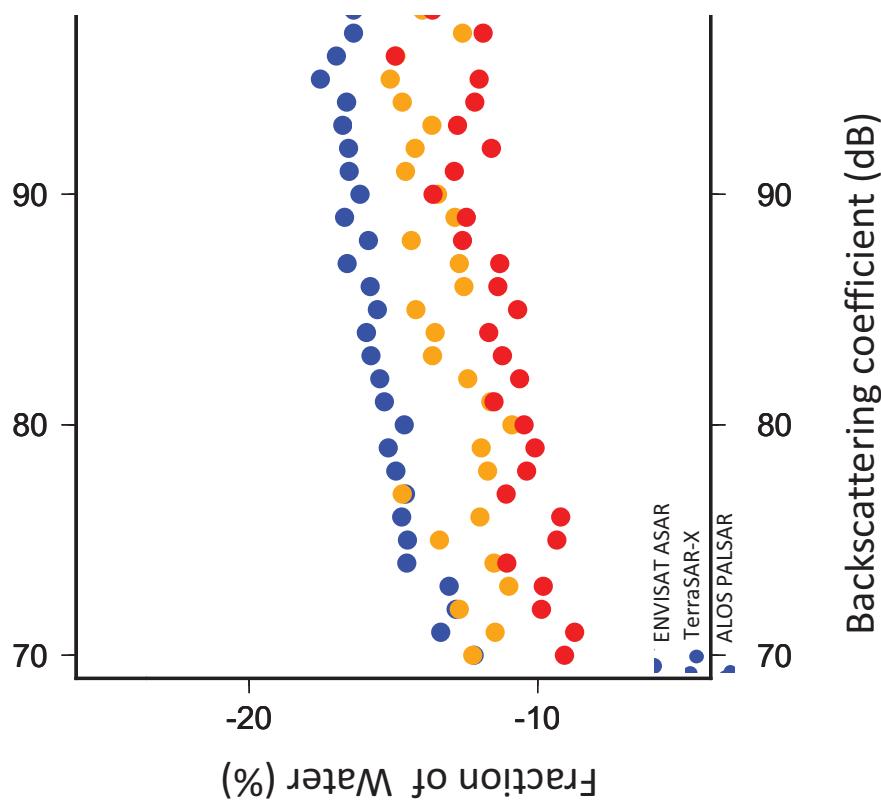
TSX
ALOS PALSAR
ENVISAT ASAR

Select Stable Water

Water occupancies are estimated by SMA using two Landsat-7 images.
The areas of stable water are selected from both results.



Relationship Between Water Occupancy and Sigma Noughts of Different SAR Images



Longer wavelength shows smaller
backscattering coefficient.