

Mapping the impact of the Typhoon Yolanda with combined approach of remote sensing, field observation and GIS analysis

Shunichi Koshimura (PI)

Erick Mas (presenter)



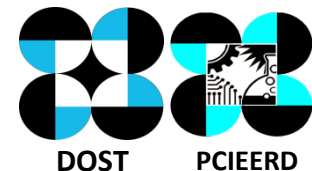
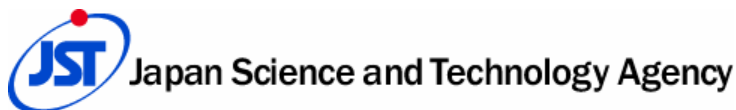
International Research Institute of Disaster Science (IRIDeS) – Tohoku University, Sendai, Japan

Ruel DM. Belen (PI)

Department of Environment and Natural Resources.
National Mapping and Resource Information Authority



Japan–Philippine Urgent Collaborative Projects
regarding “Typhoon Yolanda” within the J–RAPID Program



Outline

1. IRIDeS activities in remote sensing for damage estimation (Assist. Prof. Erick Mas)
2. NAMRIA activities in Yolanda base mapping from satellite images (Dir. Ruel DM Belen)



Republic of the Philippines
Department of Environment and Natural Resources
NATIONAL MAPPING AND RESOURCE INFORMATION AUTHORITY
MAPPING AND GEODESY BRANCH
PHOTOGRAMMETRY DIVISION
Lawton Avenue, Fort Andres Bonifacio, 1634 Taguig City

**Initial
Report**

International Research Institute of Disaster Science (IRIDeS)



17 May 2014

"IRIDeS Fact-finding missions to Philippines"

**TOHOKU University
2014**

**Second
Report**

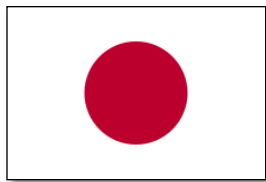
International Research Institute of Disaster Science (IRIDeS)



14 March 2015

"IRIDeS Fact-finding missions to Philippines"

**TOHOKU University
2015**



Project team members



Name	Affiliation
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Prof. Osamu Murao	IRIDeS, Tohoku University
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Asst. Prof. Erick Mas	IRIDeS, Tohoku University
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Name	Affiliation
Dr. Ruel DM. Belen	NAMRIA, Mapping and Geodesy (Director)
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Eng. Maricel D. Luna	NAMRIA, Photogrammetry

Objectives of the Project

1. Establish satellite remote sensing method and mapping technology to identify impacts and vulnerabilities in the 2013 Typhoon Yolanda affected areas and future catastrophic typhoon disasters.
2. Both research teams conduct satellite image analysis and field survey. Especially Japan team conducts satellite image analysis to identify the Typhoon Yolanda affected areas. The Philippine team conducts detailed verification of satellite image analysis with their extensive field survey results.

Methodology

- Use of multi sensor satellite images for damage mapping using remote sensing techniques.
- Verify methods with field survey data.
- Develop “storm surge fragility curves” to grasp the relationship between storm surge and structural damage.

Summary of results

1. Inundation Mapping using Normalized Water Difference Index (NDWI)
2. Spectral mixture analysis for inundation mapping
3. Visual Damage Interpretation from Satellite Images
4. Damage investigation using multi-temporal COSMO-SkyMed images
5. Damage detection using Urban Index (UI) in COSMO-SkyMed images
6. Classification of building damage levels using Normalized Difference Correlation Coefficient Index (NDCOI) in COSMO-SkyMed images
7. Phase-based change detection analysis for damage estimation

Inundation Mapping using Normalized Difference Water Index (NDWI)

Method

Normalized Difference Water Index (NDWI) using visible near-infrared (VNIR) imagery from the Advanced Spaceborne Thermal Emission and Reflection Radiometer (ASTER) enhance water features of pre- and post-event images

Advantages

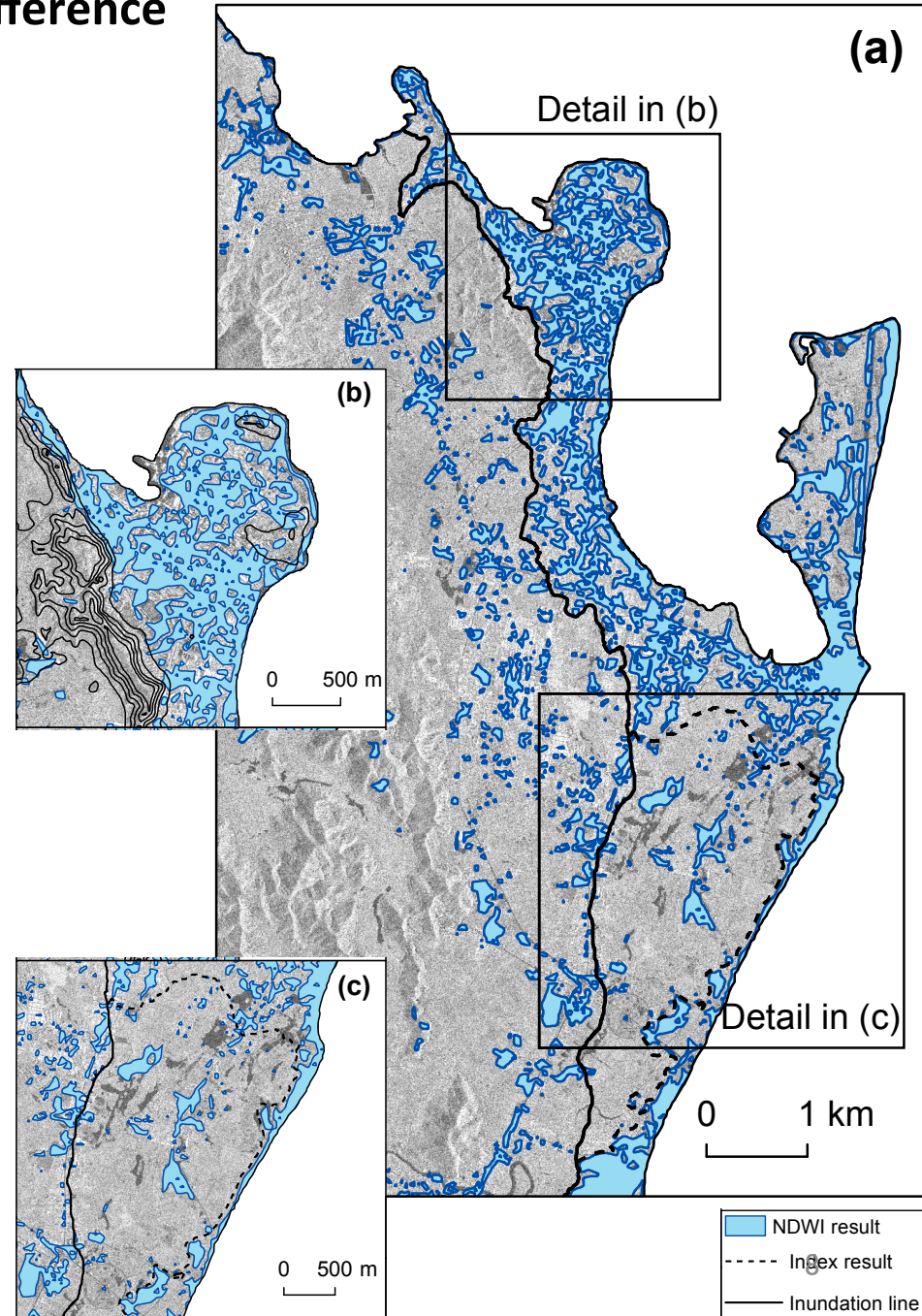
- Discover wetland areas
- Simple and fast for preliminary estimations

Limitations

- Difficult to accurately discretize wet areas due to storm surge, river flood or local rain.
- Requires field survey to confirm storm surge inundation limits.

Published on:

- Adriano, B., H. Gokon, E. Mas, S. Koshimura, W. Liu, M. Matsuoka (2014) "Extraction of damaged areas due to the 2013 Haiyan typhoon using ASTER data" *Proceedings of the International Geoscience and Remote Sensing Symposium IGARSS 2014 and 35th Canadian Symposium on Remote Sensing CSRS, Quebec, Canada, 2014.*



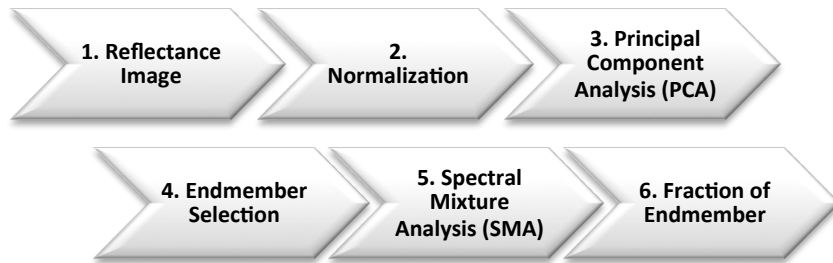
Spectral Mixture Analysis for inundation mapping

Method

Spectral Mixture Analysis (SMA) aims on resolving the MIXELS assuming a linear combination of the spectral of all end members in a pixel.

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

$$\overline{R_b} = \frac{R_b}{R} \times 100$$



$$\overline{R_b} = \sum_{i=1}^N \bar{f}_i \times \overline{R_{i,b}} + e_b$$

Advantages

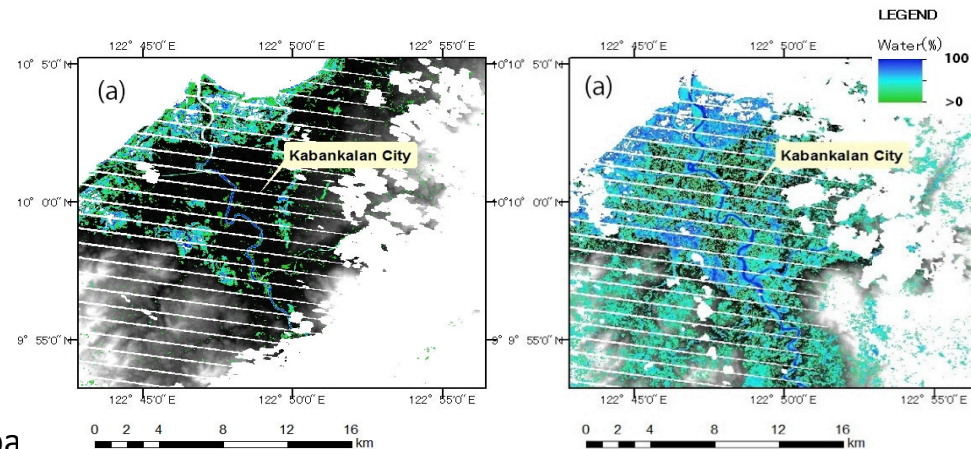
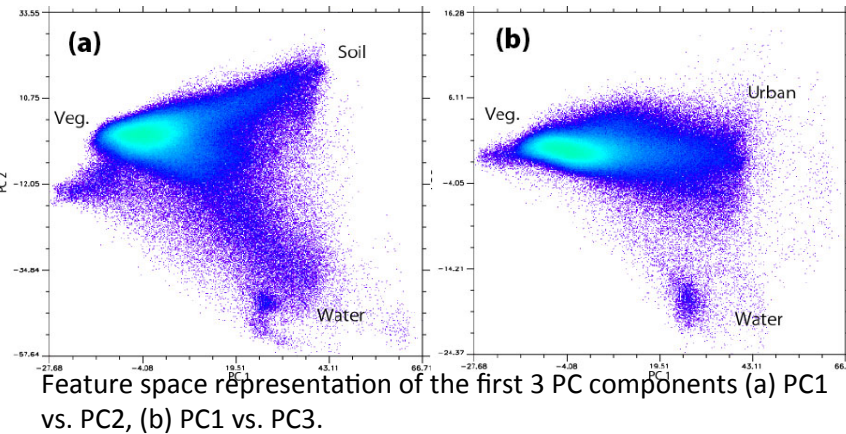
- Provides information as continuous values of water occupancy within the pixel.

Limitations

- Debris mixed with flood water may produce underestimations.
- Needs to be combined with radar images for better result and avoid cloud influence.

Published on

Shinohara, T., W. Liu, M. Matsuoka (2014). "Spectral Mixture Analysis for Typhoon-Induced Inundation Mapping in Negros and Cebu Islands, the Philippines" *Proceedings of International Symposium on Remote Sensing 2014, B08-3, 4p., CD-ROM, 2014.4.*



Visual Damage Interpretation from Satellite Images

Method

Manual Visual Damage Interpretation (comparison house by house) from pre- and post-event satellite images of the affected areas (Tacloban city).

Advantages

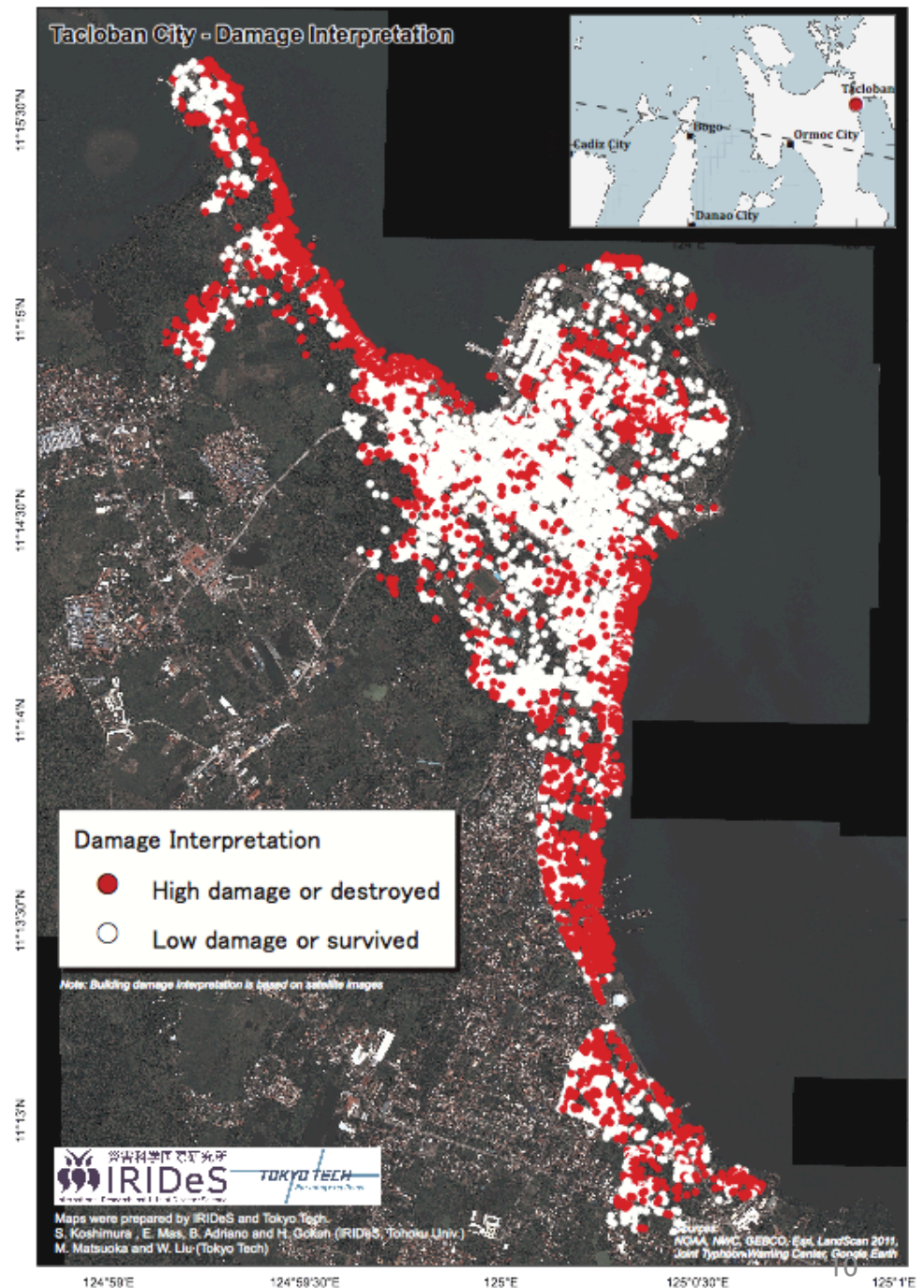
- Straightforward method.
- High accuracy when very high resolution images are used.

Limitations

- Subjective interpretation by the user eye.
- Images depend on weather conditions (lack of visibility due to clouds)
- Time consuming
- Underestimations for first floor damage due to storm surge but no damage on roofs.

Published on:

- Mas E., J.D. Bricker, S. Kure, B. Adriano, C.J. Yi, A. Suppasri, and S. Koshimura (2014a). "Field survey report and satellite image interpretation of the 2013 Super Typhoon Haiyan in the Philippines" *Natural Hazards and Earth System Sciences (in press)*
- Mas E., S. Kure, J.D. Bricker, B. Adriano, C.J. Yi, A. Suppasri, and S. Koshimura (2014b). "Field survey and damage inspection after the 2013 Typhoon Haiyan in The Philippines" *Journal of Japan Society of Civil Engineers, Ser. B2 (Coastal Engineering), Vo. 70, No.2, pp.1_1451-1_1455.*



Damage Investigation using multi-temporal COSMO-SkyMed images

Method

Multi Temporal Correlation (MTR) and Hyperboloid Change Index (Δh) yields better visible results than only difference methods (Δd), weight method (Δw) or radius method (Δr) for change detection.

Advantages

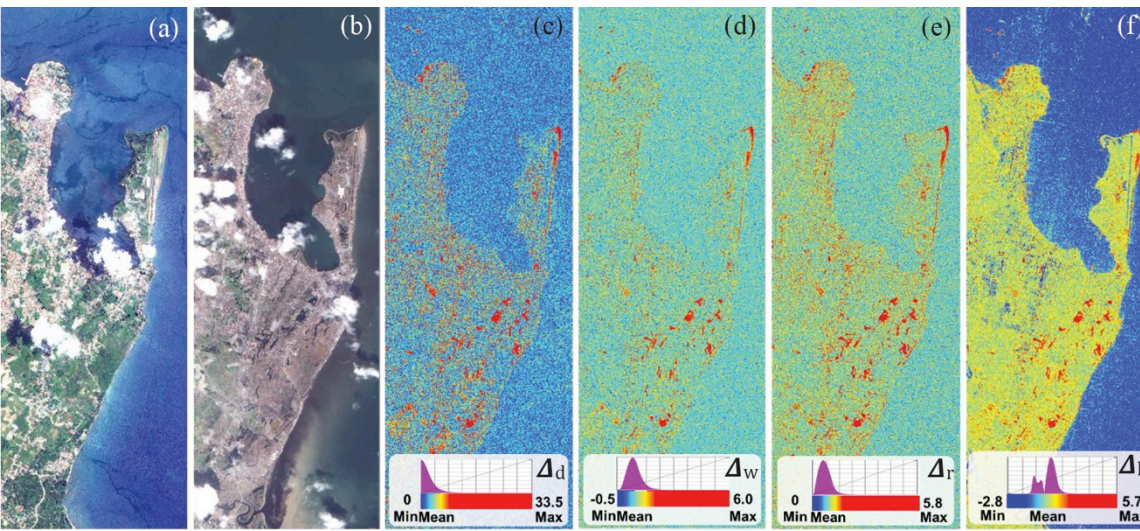
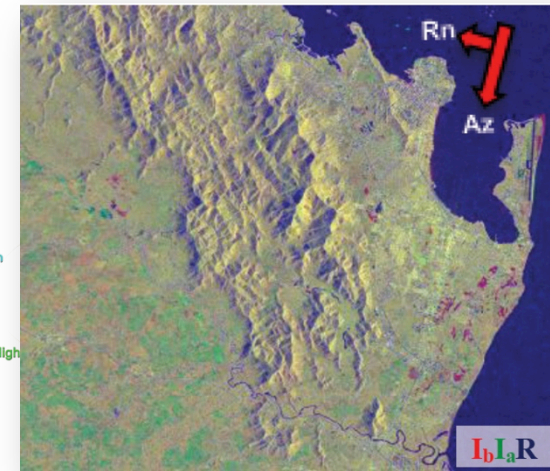
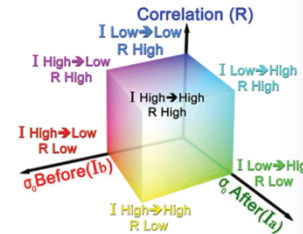
- Suitable for detecting impact of disasters.
- Suitable for detecting vegetation growth.

Limitations

- For damage assessment requires a pair of images taken in short time-interval (as in other methods).
- Difficult to separate building damage from debris spreading.

Published on:

- Nakmuenwai, P., F. Yamazaki (2014) "Damage investigation for the 2013 Typhoon Haiyan in the Philippines using multi-temporal COSMO-SkyMed images" *Proceedings of the IEEE 2014 International Geoscience and Remote Sensing Symposium, Quebec, Canada, 2261-2264, 2014.7*



Damage Detection using Urban Index (UI) in COSMO-SkyMed Images

Method

Urban Index (UI) calculated from the pre- and post-event COSMO-SkyMed intensity images is used to extract severe damaged area.

$$UI = \frac{Int - \mu_{Int}}{\sigma_{Int}} + \frac{SPD - \mu_{SPD}}{\sigma_{SPD}}$$
$$SPD = \frac{\langle \sigma_{Int} \rangle}{\langle \mu_{Int} \rangle} - \frac{1}{C}$$

Int: backscattering intensity

C: number of total looks

Advantages

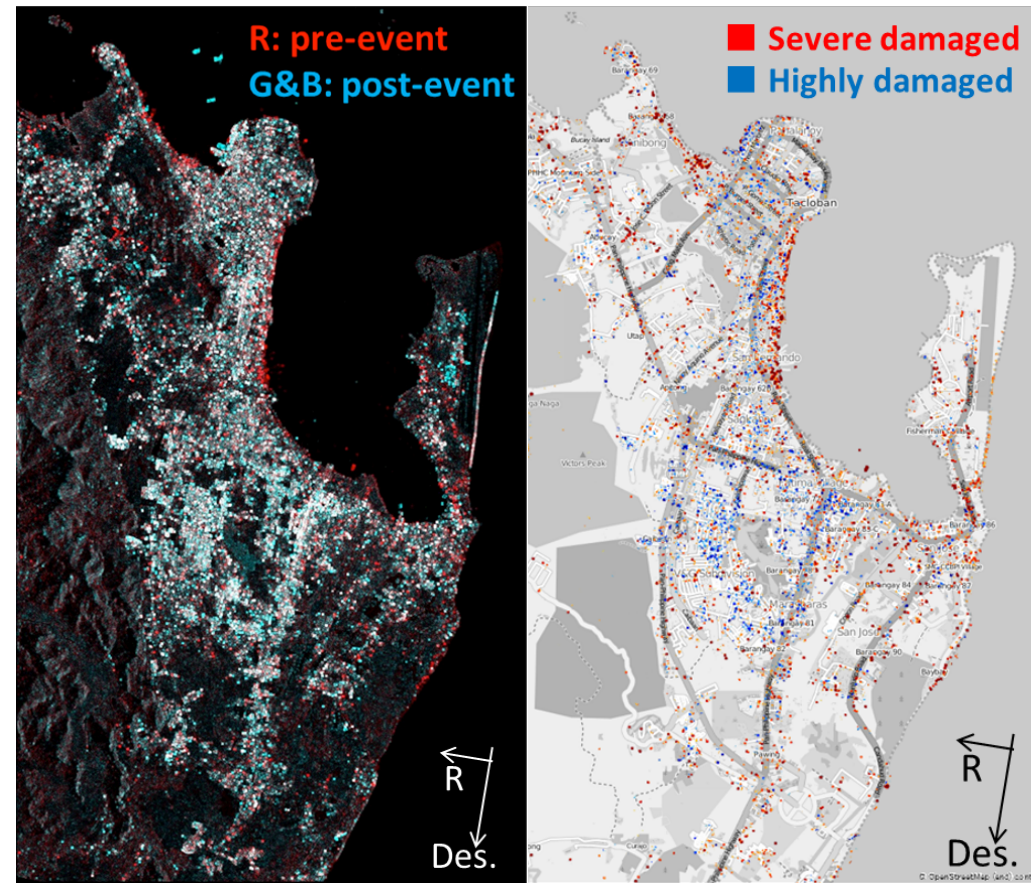
- Simple and fast for preliminary estimations
- Grasp the damage level

Limitations

- Only work in urban area
- Difficult for small houses

Published on

Liu, W., M. Matsuoka, B. Adriano, E. Mas, S. Koshimura (2014) "Damage detection due to the Typhoon Haiyan from high resolution SAR images" *Proceedings of the International Geoscience and Remote Sensing Symposium IGARSS 2014 and 35th Canadian Symposium on Remote Sensing CSRS, Quebec, Canada, 2014.*



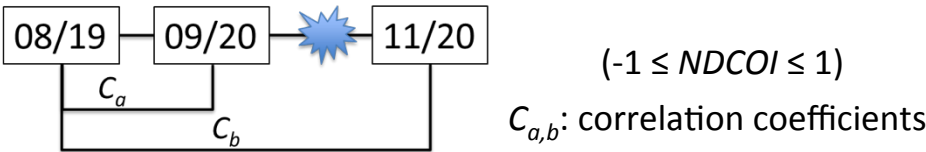
Color composite of the pre- and post-event *UI*

Damage areas extracted by *UI* changes ($|D_{UI}| > 1.5$)

Classification of Building Damage Levels using NDCOI in COSMO-SkyMed Images

Method

Normalized difference correlation coefficient index (NDCOI) Model is built for classifying the damage level of individual buildings, by introducing the visual interpreted grading results.



$$NDCOI = \frac{(C_a + 1) - (C_b + 1)}{(C_a + 1) + (C_b + 1)}$$

Advantages

- Possibility of the different damage levels can be calculated for each individual building
- The model can be applied to other areas easily

Limitations

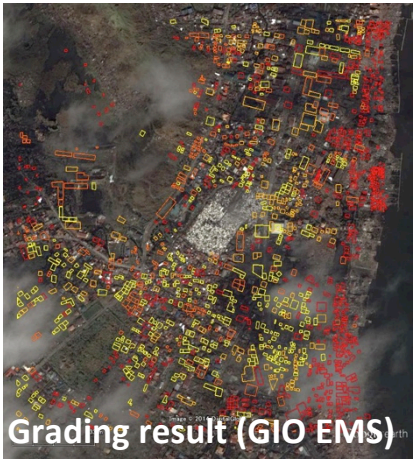
- Training data are necessary
- Two pre-event images are needed at least

Published on

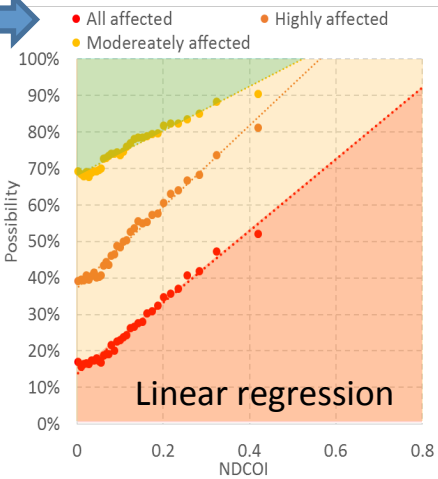
Liu, W., M. Matsuoka, B. Adriano, E. Mas, S. Koshimura (2014) "Damage detection due to the Typhoon Haiyan from high resolution SAR images" *Proceedings of the International Geoscience and Remote Sensing Symposium IGARSS 2014 and 35th Canadian Symposium on Remote Sensing CSRS, Quebec, Canada, 2014.*

- Totally affected (3,206 buildings)
- Highly affected (1,101 buildings)
- Moderately affected (733 buildings)
- Non or possibly affected (1,082 buildings)

Training data



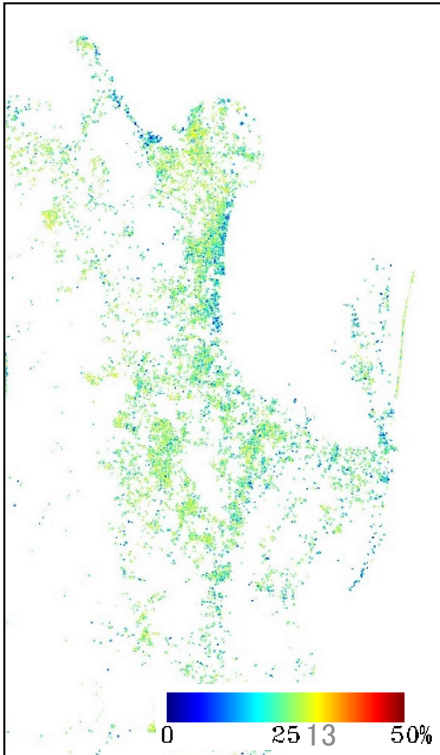
NDCOI model



Possibility of totally affected



Possibility of non or possibly affected



Phase-based change detection analysis for damage estimation

Method

Phase-based only correlation (POC) for accurate image matching. POC is the 2D Inverse Discrete Fourier Transform (2D IDFT) of the cross-phase spectrum.

$$\hat{R}_{FG}(k_1, k_2) = \frac{F(k_1, k_2) \overline{G(k_1, k_2)}}{|F(k_1, k_2) \overline{G(k_1, k_2)}|} = e^{j\theta(k_1, k_2)}$$

$$\hat{r}_{fg}(n_1, n_2) = \begin{cases} 1 & \text{if } n_1 = n_2 = 0 \\ 0 & \text{otherwise} \end{cases}$$

Advantages

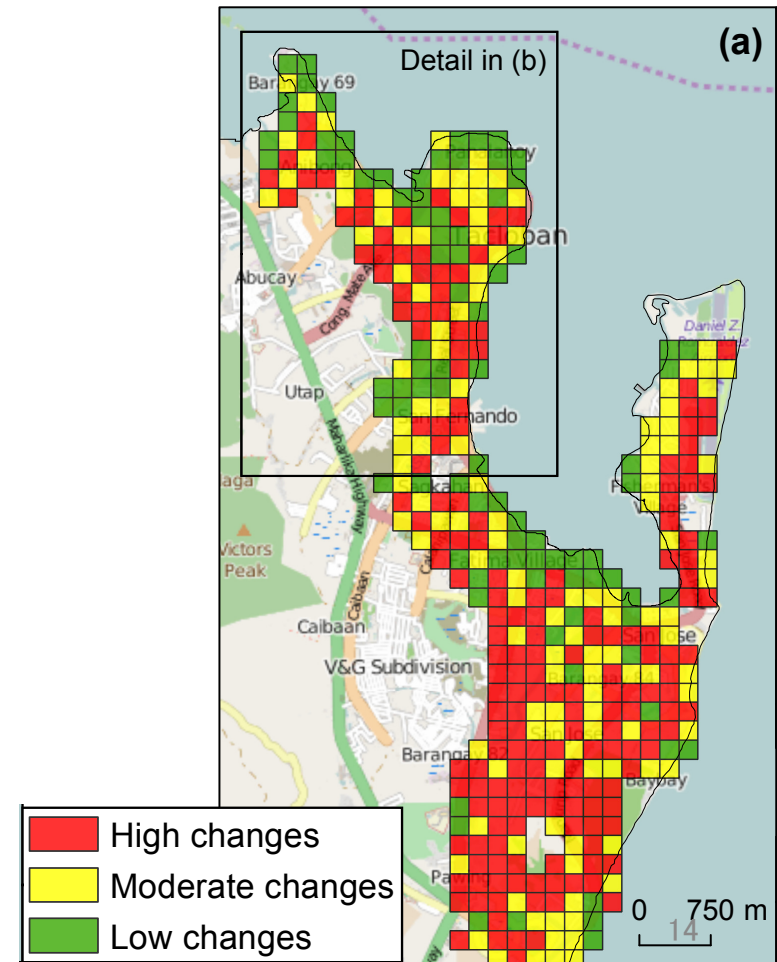
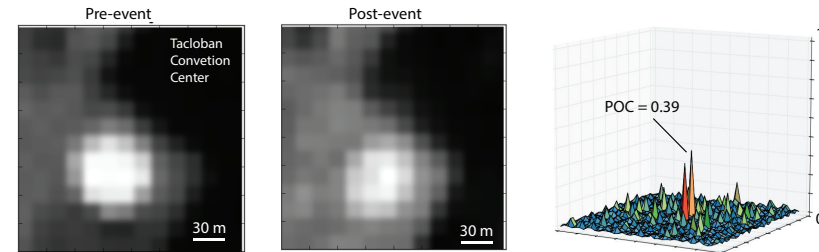
- High accuracy on image matching compared to ordinary correlations.

Limitations

- Building damage estimation depends on image resolution. Underestimations result from building representation in low resolution images.
- If applied in optical images, cloud visibility can lead to errors.

Published on

Adriano, B., H. Gokon, E. Mas, S. Koshimura, W. Liu, M. Matsuoka (2014a) "Extraction of damaged areas due to the 2013 Haiyan typhoon using ASTER data" *Proceedings of the International Geoscience and Remote Sensing Symposium IGARSS 2014 and 35th Canadian Symposium on Remote Sensing CSRS, Quebec, Canada, 2014.*



Images used and acquisition time

Type	Sensor	Date	Availability	Application in this project
Pre-	Google Earth (RGB)	23 Feb. 2012	Free	Damage Est.
	ASTER (VNIR)	01 Jun. 2008	Purchased	Inund. Mapp.
	COSMO-SkyMed (CSK-1, SAR)	7 & 19 Aug. 2013	Purchased	Damage Est.
	ThaiChote(THEOS) (TH1, RGB-NIR)	29 Aug. 2013	Purchased	Damage Est.
	COSMO-SkyMed (CSK-1, SAR)	20 Sep. 2013	Purchased	Damage Est.
	Landsat-7 ETM+	28 Oct. 2013	Free	Inund. Mapp.
Post-	Digital Globe [in Google Earth] (RGB)	13 Nov. 2013	Free	Damage Est.
	Landsat-7 ETM+	13 Nov. 2013	Free	Inund. Mapp.
	ThaiChote (THEOS)(TH1, RGB-NIR)	13 Nov. 2013	Purchased	Damage Est.
	ASTER (VNIR)	15 Nov. 2013	Purchased	Inund. Mapp.
	COSMO-SkyMed (CSK-3, SAR)	20 Nov. 2013	Purchased	Damage Est.

Tacloban city was hit by Typhoon Haiyan on 8 Nov. 2013. In this particular case after 5 days damage information could be grasp in the wide affected areas. Less days are possible!

Publications

1. Mas E., J.D. Bricker, S. Kure, B. Adriano, C.J. Yi, A. Suppasri, and S. Koshimura (2015). "Field survey report and satellite image interpretation of the 2013 Super Typhoon Haiyan in the Philippines" *Natural Hazards and Earth System Sciences (in press)*
2. Mas E., S. Kure, J.D. Bricker, B. Adriano, C.J. Yi, A. Suppasri, and S. Koshimura (2014). "Field survey and damage inspection after the 2013 Typhoon Haiyan in The Philippines" *Journal of Japan Society of Civil Engineers, Ser. B2 (Coastal Engineering), Vo. 70, No.2, pp.1_1451-1_1455.*
3. Adriano, B., H. Gokon, E. Mas, S. Koshimura, W. Liu, M. Matsuoka (2015) "Mapping of damaged areas at Tacloban city, Philippines due to the 2013 Super Typhoon Haiyan using moderate-resolution satellite images" *Coastal Engineering Journal, Special Issue (submitted).*
4. Adriano, B., H. Gokon, E. Mas, S. Koshimura, W. Liu, M. Matsuoka (2014a) "Extraction of damaged areas due to the 2013 Haiyan typhoon using ASTER data" *Proceedings of the International Geoscience and Remote Sensing Symposium IGARSS 2014 and 35th Canadian Symposium on Remote Sensing CSRS, Quebec, Canada, 2014.*
5. Adriano B., H. Gokon, E. Mas, S. Koshimura, W. Liu, M. Matsuoka (2014b). "Application of a phase-based correlation Method to extract damage areas, case of Study: 2013 Haiyan Typhoon" *Proceedings of the 14th Japan Earthquake Engineering Symposium, Chiba, Japan.*
6. Adriano, B., E., Mas, H. Gokon, S. Koshimura (2015). "Impact of the 2013 Haiyan event inferred from the change of SAR intensity images" *International Conference on Building Resilience and Developing Sustainability, Cordillera Studies Center, University of the Philippines Baguio. Baguio City, Philippines.*
7. Shinohara, T., W. Liu, M. Matsuoka (2014). "Spectral Mixture Analysis for Typhoon-Induced Inundation Mapping in Negros and Cebu Islands, the Philippines" *Proceedings of International Symposium on Remote Sensing 2014, B08-3, 4p., CD-ROM, 2014.4.*
8. 篠原崇之, リュウ ウェン, 松岡昌志 (2014) "RISAT-1/SARとLandsat/ETM+を用いた台風Haiyanによる浸水域の抽出" *日本リモートセンシング学会第56回学術講演会論文集, pp.23-26, 2014.5.*
9. Liu, W., M. Matsuoka, B. Adriano, E. Mas, S. Koshimura (2014) "Damage detection due to the Typhoon Haiyan from high resolution SAR images" *Proceedings of the International Geoscience and Remote Sensing Symposium IGARSS 2014 and 35th Canadian Symposium on Remote Sensing CSRS, Quebec, Canada, 2014.*
10. リュウ ウェン, 松岡昌志, アドリアノ ブルーノ, マス エリック, 越村俊一 (2014) "COSMO-SkyMed強度画像を用いたフィリピン台風被害の検出" *日本リモートセンシング学会第56回学術講演会論文集, pp.73-74, 2014.5.*
11. Nakmuenwai, P., F. Yamazaki (2014) "Damage investigation for the 2013 Typhoon Haiyan in the Philippines using multi-temporal COSMO-SkyMed images" *Proceedings of the IEEE 2014 International Geoscience and Remote Sensing Symposium, Quebec, Canada, 2261-2264, 2014.7*

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Presentation Outline:

- Background
- Activities
- Coverage Areas
- Image Sources
- Image Processing
- Feature Extraction
- Field Verification/Identification
- Geospatial Database

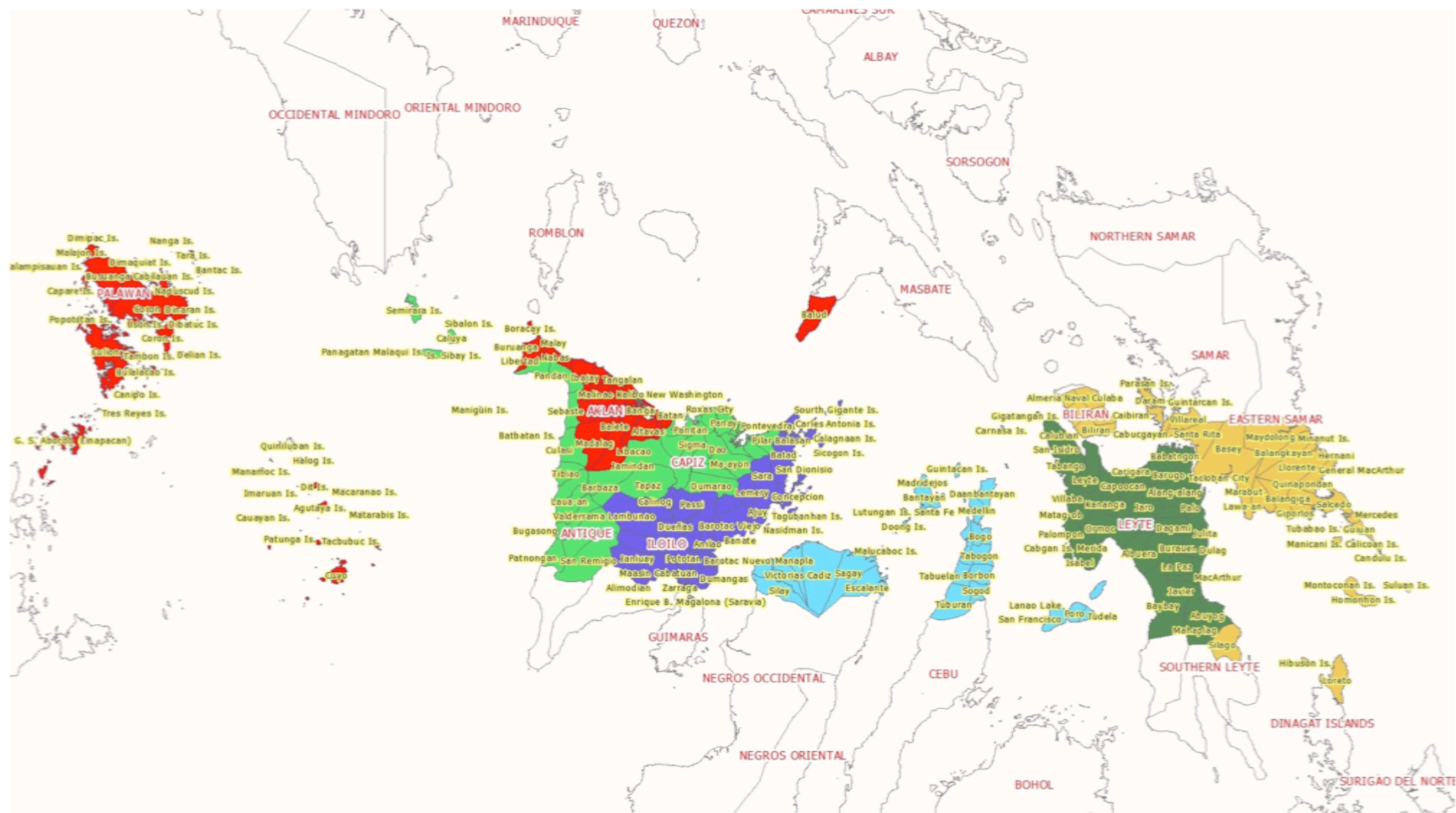
Background

- Unified Mapping Project (UMP) -
 - production of large scale topographic and orthoimage base maps for the entire country;
 - will serve as common base maps for various thematic applications
 - Typhoon Yolanda Corridor as priority area through MOA with Office of the Presidential Assistance for Rehabilitation and Recovery (OPARR)

Activities

- Image Processing
- Feature Extraction
- Field Verification/Identification
- Map Printing

Coverage Areas:

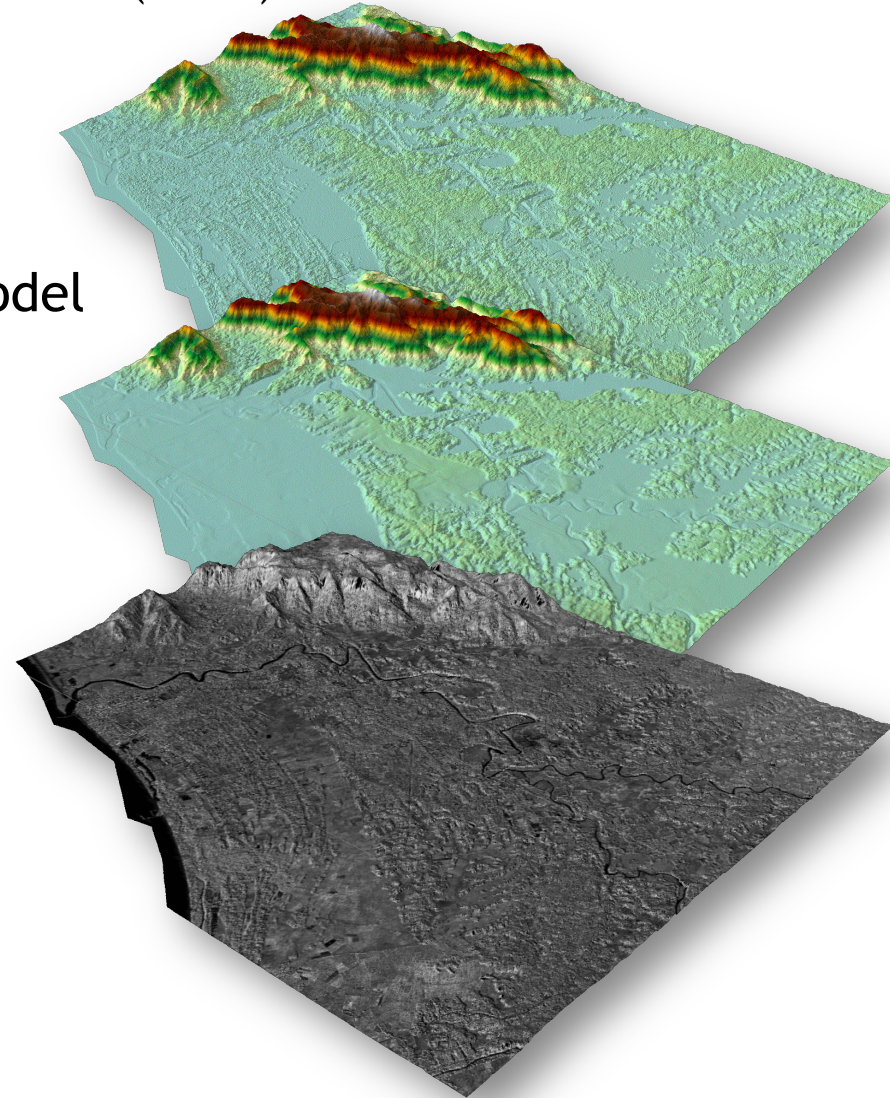


Yolanda affected areas identified by OPARR
11 Cities & 160 Municipalities, approx. 2,365,500 has.

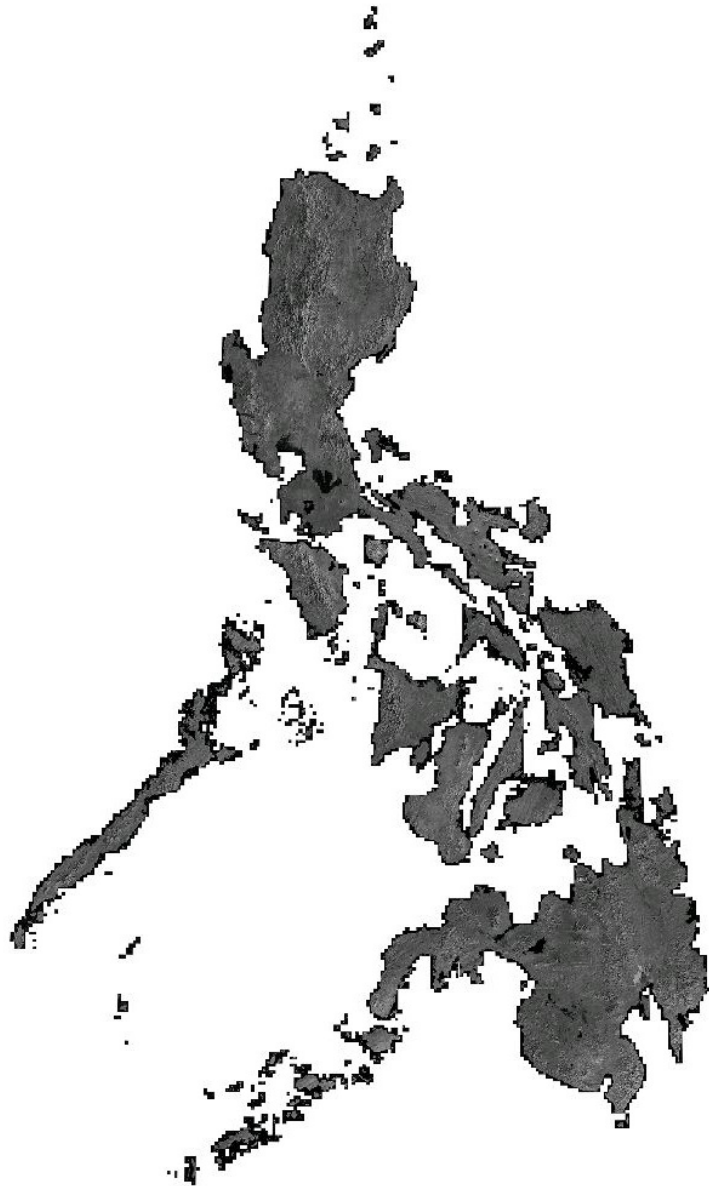
Remote Sensing Data Utilized

1) Interferometric Synthetic Aperture Radar (IfSAR) Data

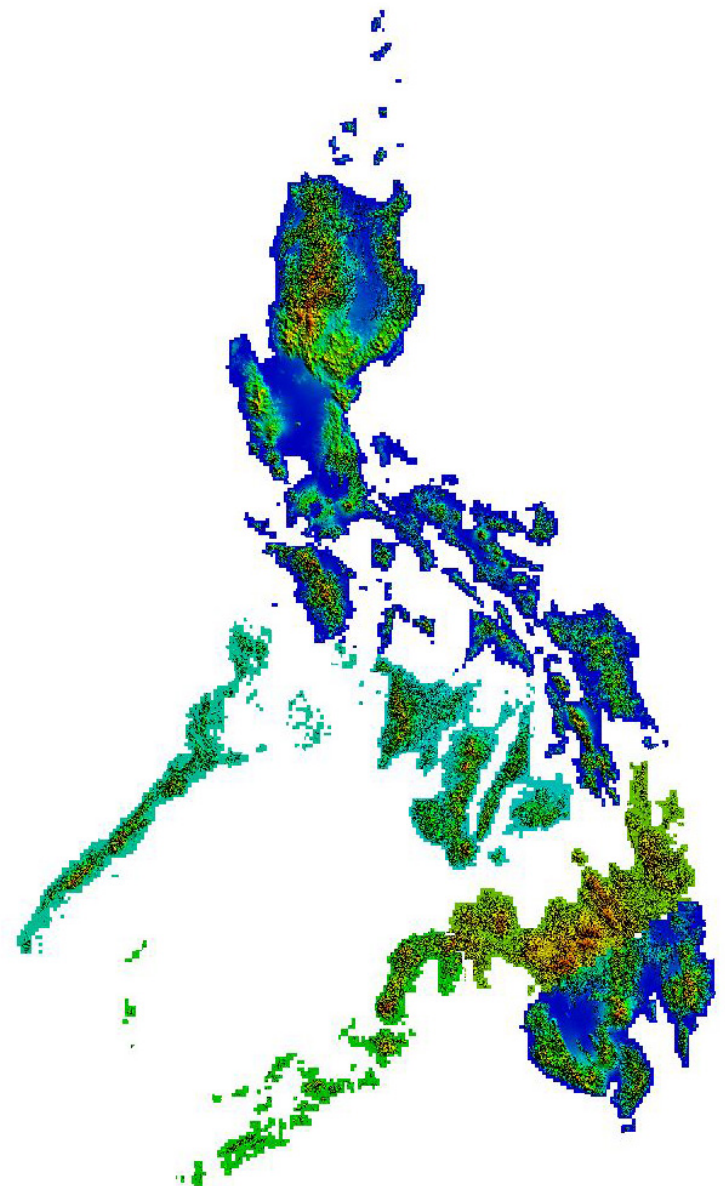
- Acquired 2013
- Nationwide Coverage
- High Resolution Digital Elevation Model
 - Digital Surface Model (DSM)
 - Digital Terrain Model (DTM)
- Orthorectified Radar Image (ORI)
- 5.0m Resolution DEM
- 0.625m Resolution ORI
- 1.0m RMSE Vertical Accuracy
- 2.0m RMSE Horizontal Accuracy



UNIFIED MAPPING PROJECT
IFSAR ORTHORECTIFIED RADAR IMAGE
(ORI)



UNIFIED MAPPING PROJECT
IFSAR DIGITAL ELEVATION MODEL (DEM)

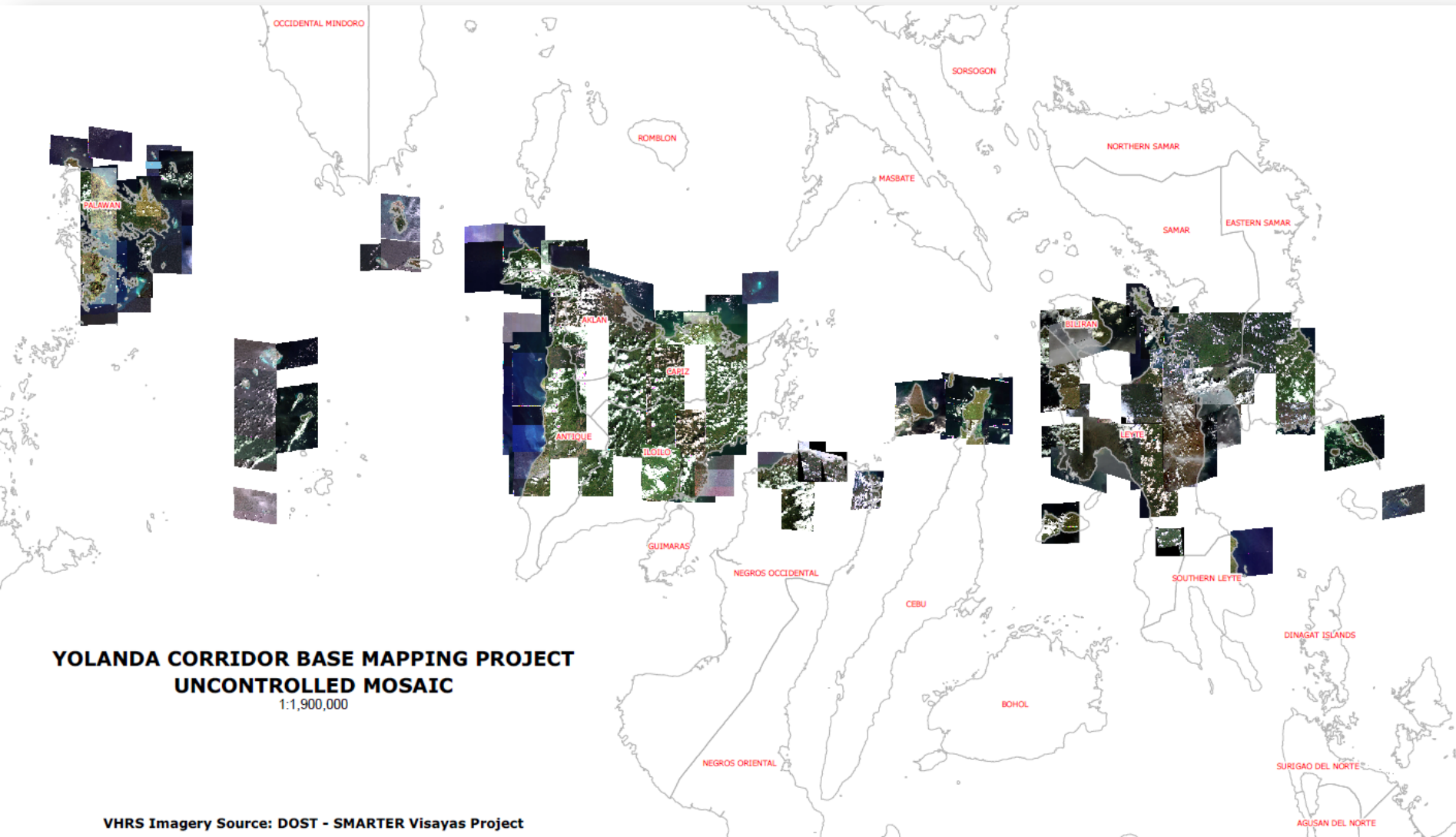


Remote Sensing Data Utilized

2) Very High Resolution Satellite Images

- Pleiades
 - through MOA with JICA
- World View 2 (50 cm resolution)
 - from DOST (satellite tasking for Yolanda corridor)
 - 2nd license agreement with Dept. of Agriculture

Image Source:



WorldView 2 (Post Yolanda)
Satellite Tasking

Image Source:



Pleiades Satellite Images Provided by JICA

Extended License From DA

- Covering Entire Country
- WorldView 2
- GeoEye
- Archive Images(from 2010 to 2014)



Image Processing:

Raw VHRS Imagery
Digital Elevation Model



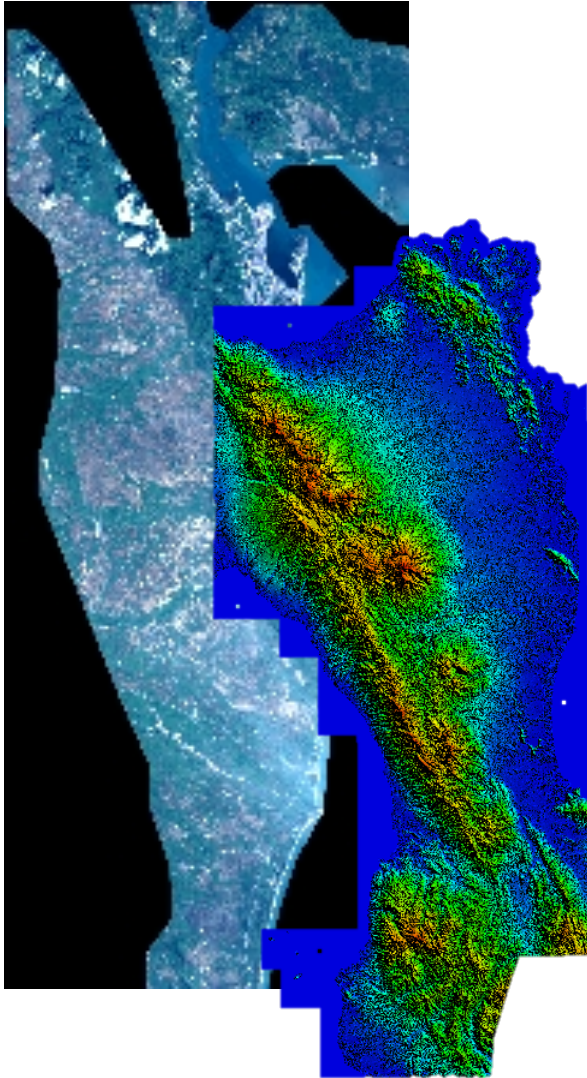
Ground Control
Points



ORTHORECTIFY



Orthoimage
Pansharpened
Natural Color

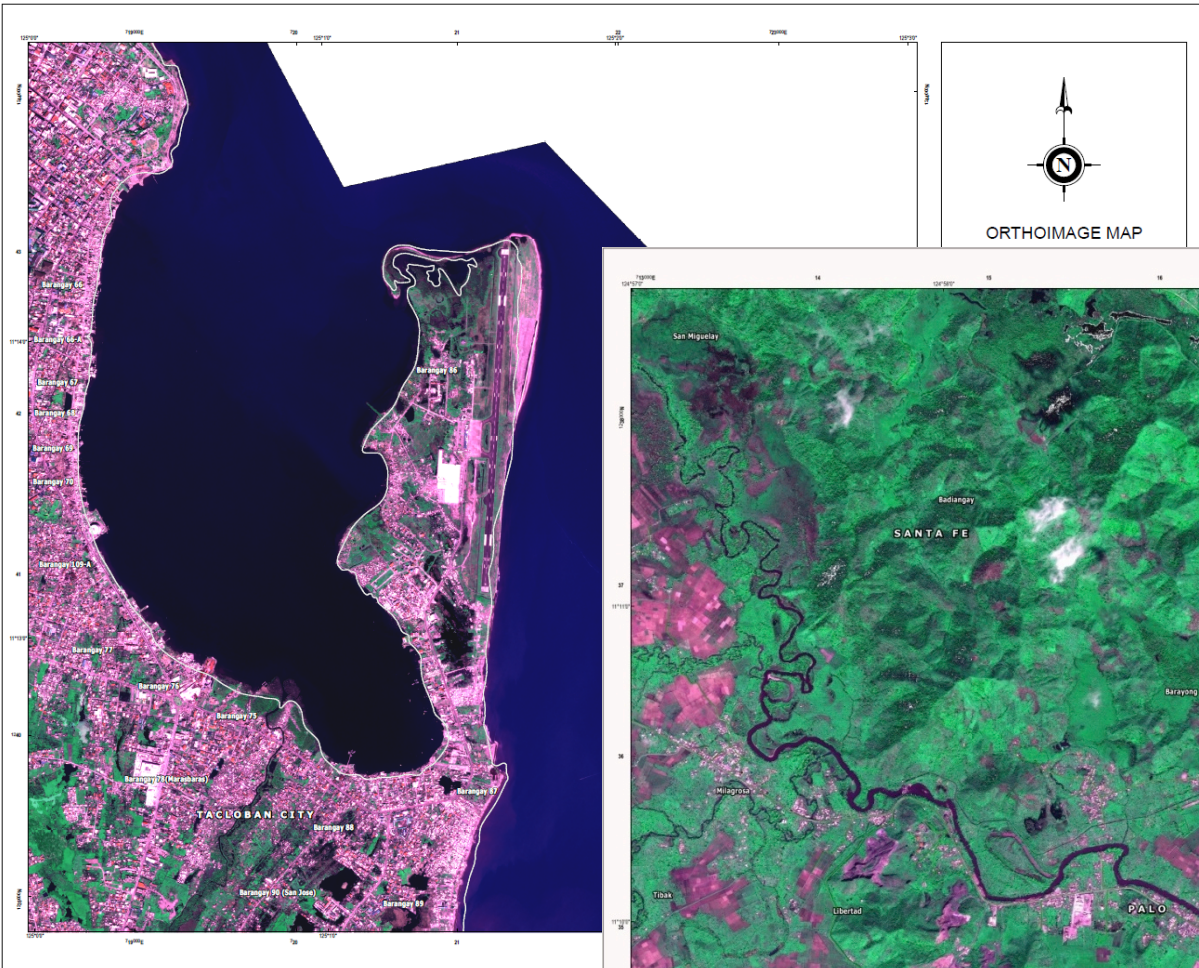


ORI

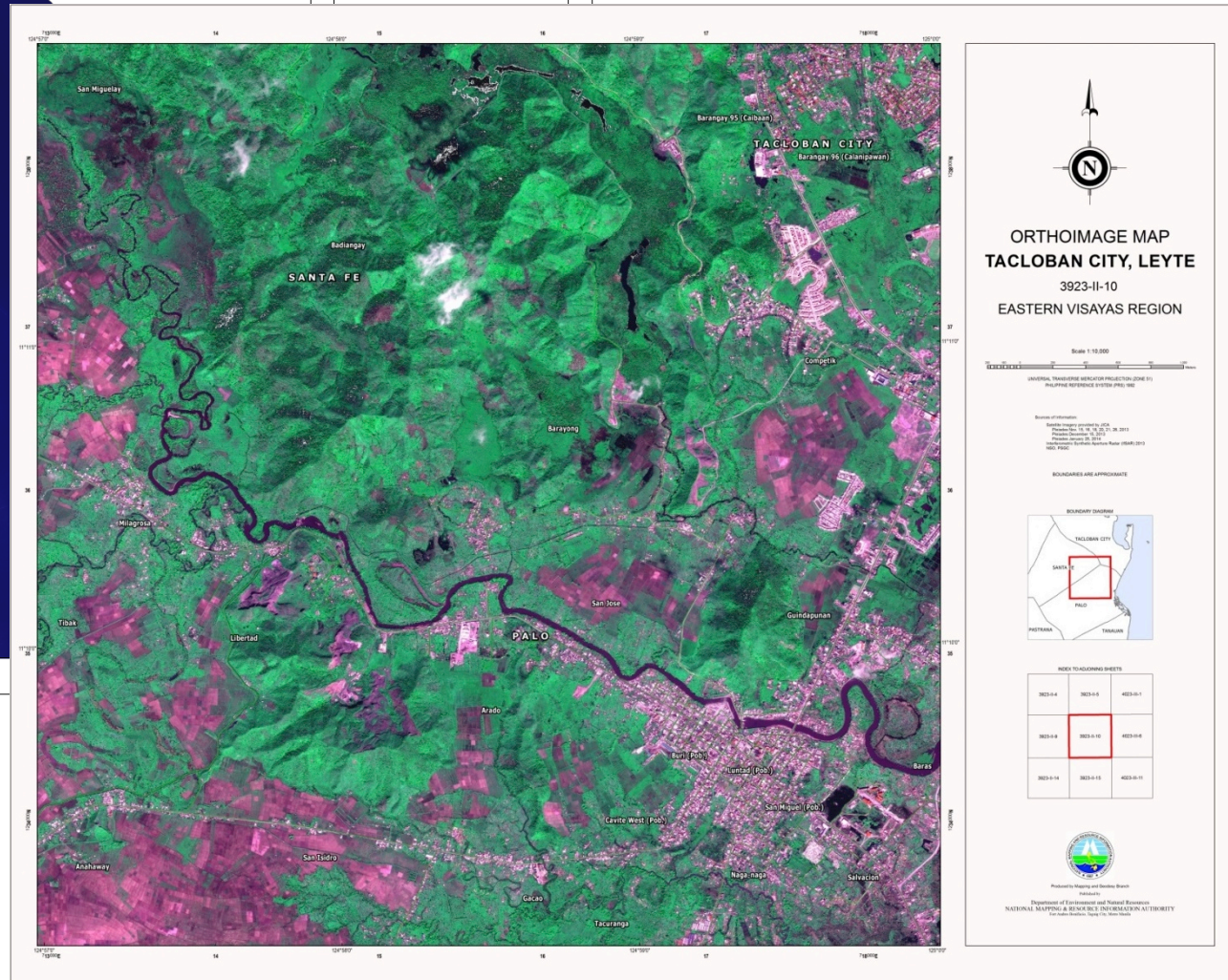
SURVEY



Image Processing:

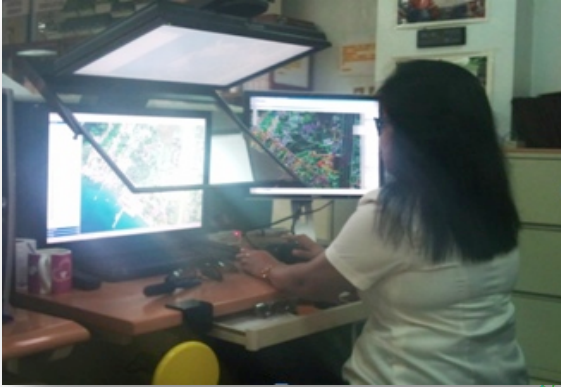


Orthoimage Map

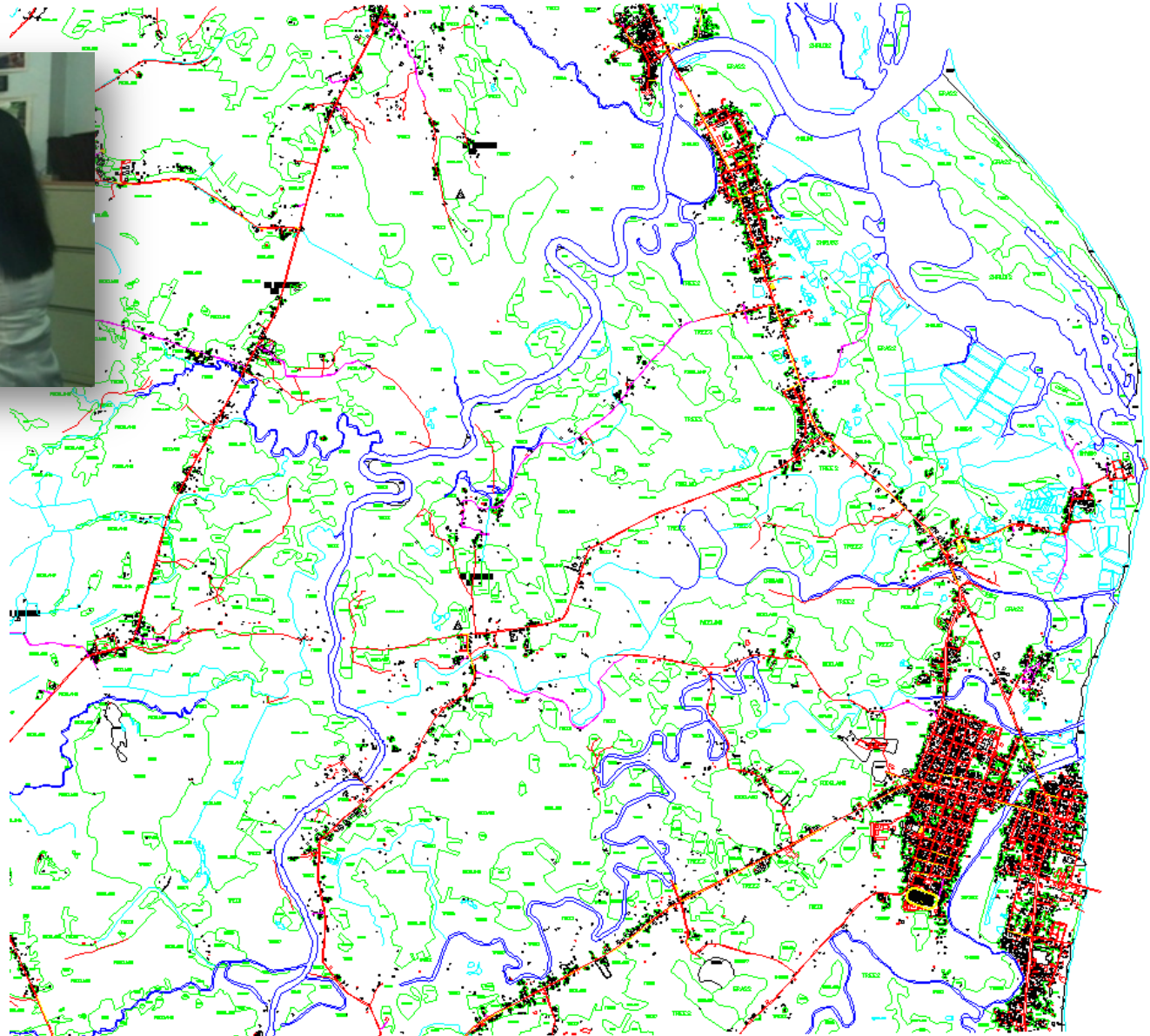


Feature Extraction:

Planimetric Compilation



- Road Network
- River Network
- Buildings / Houses
- Land Cover



Field Verification/Validation:

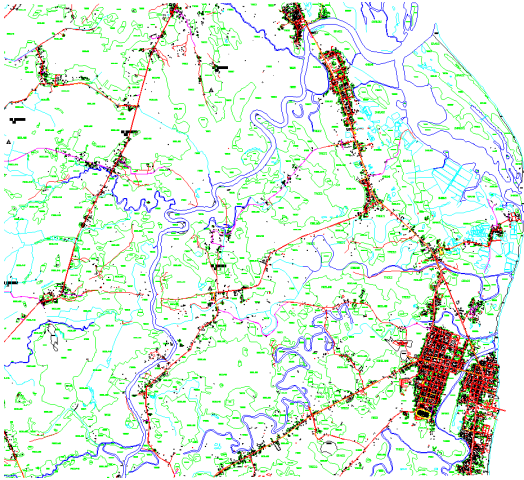
Verification & Gathering of Secondary Information



ROAD / TRANSPORTATION	
	Names of roads/street names, railways, railway stations
	Road surface classification as to: Concrete, Asphalt, Earth or Gravel
WATER AND ASSOCIATED FEATURES	
	Name of river, creek, canal, and lagoon
	Name of lake, other water bodies
BRIDGE / TUNNEL	
	Name of bridges / tunnels
BUILDING	
	School / University / College
	Barangay Hall / Health Center
	Church / Chapel / Mosque / Mission / Other religion
	Hospital
	Police station / military camp – reservation
	Other government agencies
	Prominent Building / Establishment / Commercial / Industrial
	Gasoline Station
	Lighthouse
SUBDIVISION / VILLAGE	
	Name of subdivision / Village / Sitio / Settlement
ADMINISTRATIVE AND GEOGRAPHICAL NAMES, ADMINISTRATIVE BOUNDARIES	
	Provincial boundary / Province name
	City or Municipal boundary / City or Municipal name
	Barangay boundary (if available) / Barangay name
VEGETATION	
	Vegetation Cover, i.e. rice field, crop land / agricultural land, orchard, mangrove, broadleaf, mixed scrub & broadleaf, grass, swamp / marsh, coconut, bushes / scrub
Others	
	Cemetery / Memorial Park
	Pier / Jetty / Port
	Bus Terminal / Airport
	Monument name / Landmark / Park / Recreation Areas
	Mountain Name
	Agriculture Farm / Hatchery
	Tower / Radio / Communication / Cell Site Name

Geospatial Database:

Extracted Features

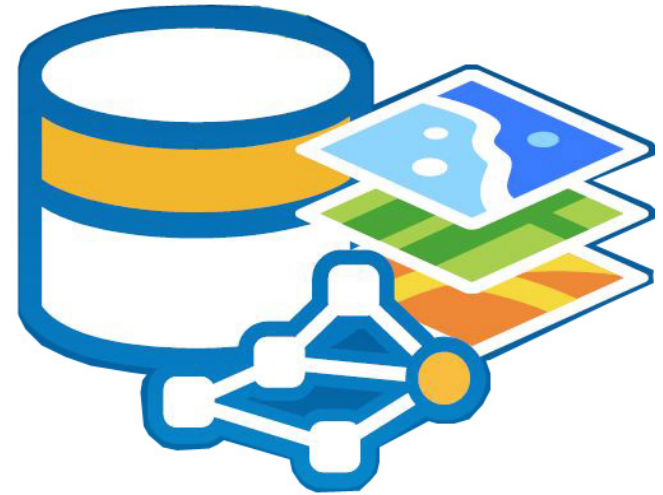


+

Field Data

=

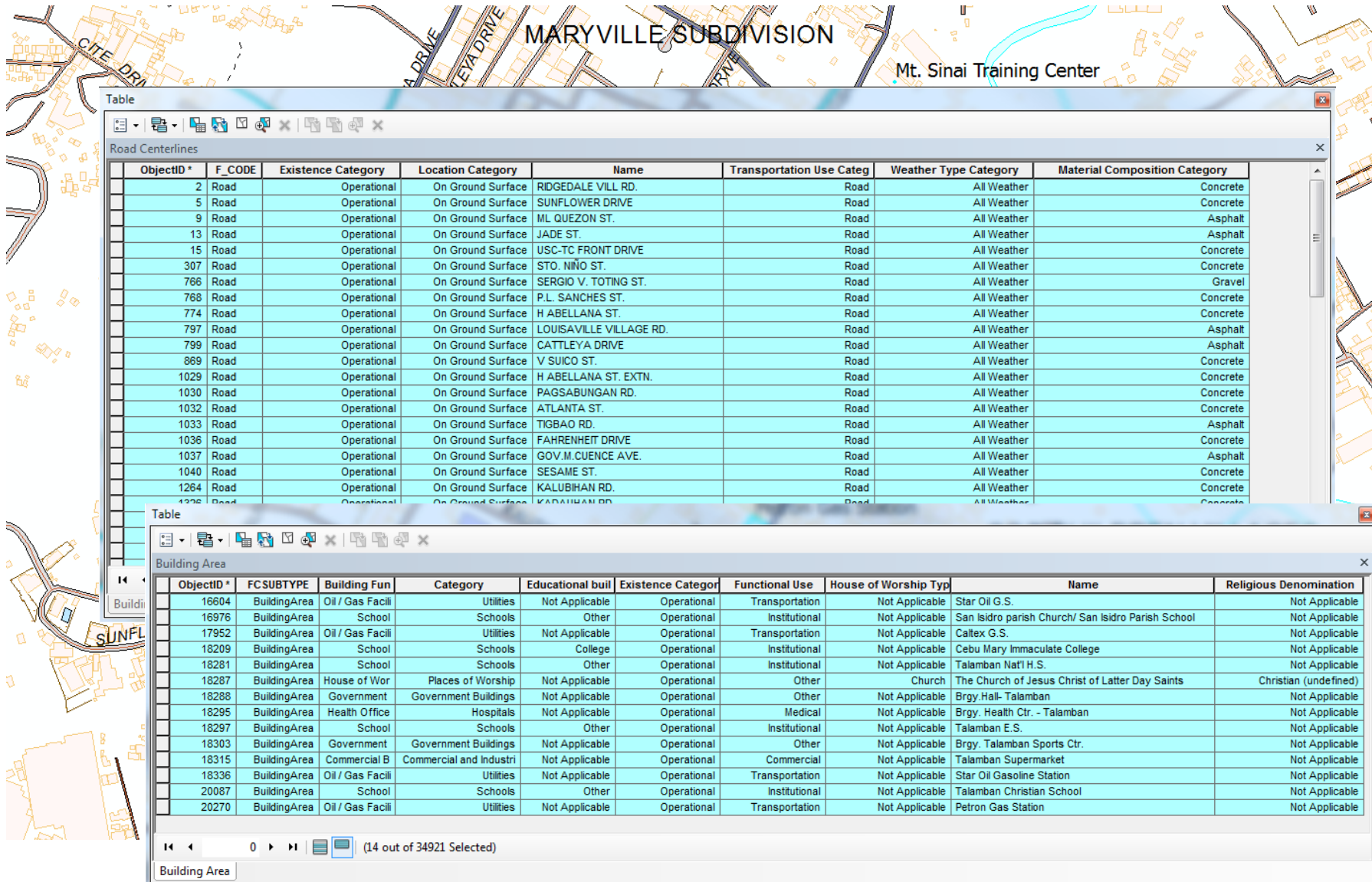
Geodatabase



- Data Conversion
- Quality Control
- Topology Check
- Data Validation
- NAMRIA Topographic Line Map

Geospatial Database:

- Spatial data with attributes stored in a database

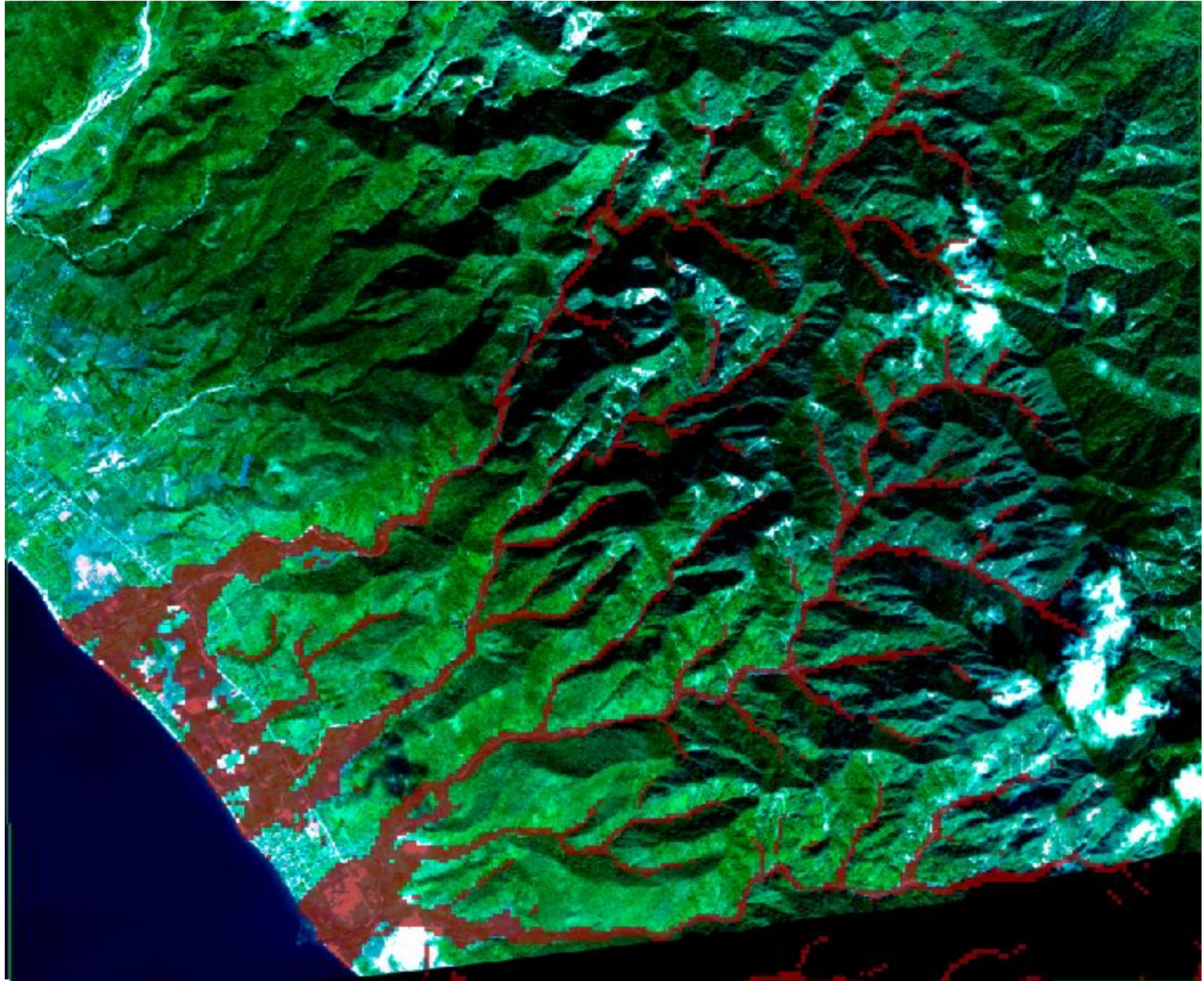


Production of Harmonized Multi-Hazard Maps for Yolanda-Affected Areas

- Joint DENR-DILG-DND-DPWH-DOST Memorandum Circular No. 2014-1, dated 05 November 2014;
- NAMRIA tasked to integrate all hazard maps and make available to all government agencies concerned the multi-hazard maps at scale 1:10,000;
- NAMRIA to establish a segment in the Geoportal for multihazard maps for access of all concerned;
- Status: Harmonized Multi-Hazard Maps continuously being integrated and uploaded in the Geoportal

Portion of Baybay, Leyte

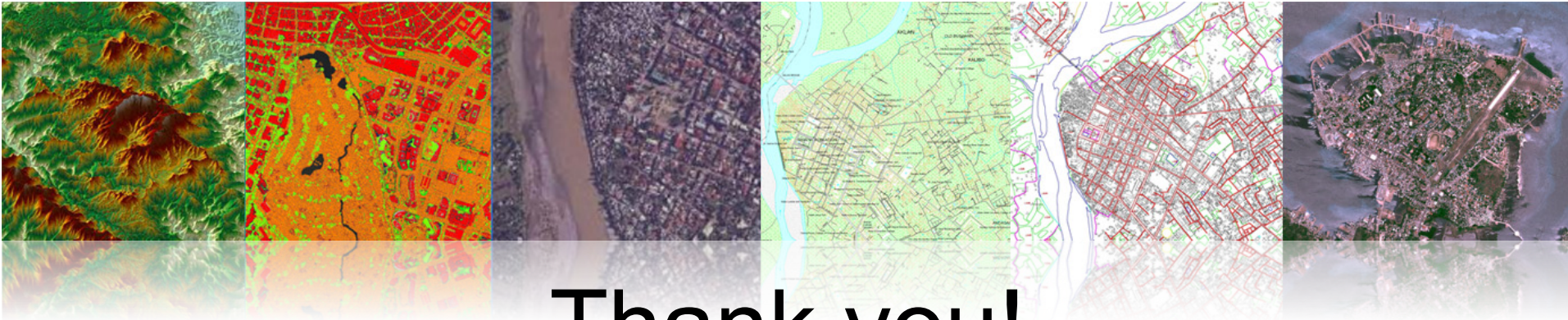
(100-Year Flood)



1:40,000



1:10,000



Thank you!



Republic of the Philippines
Department of Environment and Natural Resources
NATIONAL MAPPING AND RESOURCE INFORMATION AUTHORITY
MAPPING AND GEODESY BRANCH
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