

# A flood index based on EO big data for an improved flood mapping, depth estimation and impact assessment in a changing climate

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FC4  
FC5

# Floods happen!



sses

omic

## Slide 2

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**FC4**      Inserire immagine inondazione

Fabio Cian, 2/5/2016

**FC5**      grafico munich re su incremento di flood damage

Fabio Cian, 2/5/2016

# Floods happen!



**Floods** (riverine, flash and coastal floods) are the **greatest sources of losses** in the globe

Impacts are **constantly increasing** with **climate change** and **socio-economic change** as main drivers

**Flood risk** is not sufficiently understood

Data from satellites show potential for supporting **decision making processes** in order to **reduce losses** and increase adapting an coping capacity

**Knowledge gap** between stakeholders and RS

**Sources:**

Mysiak, J. (2013). Towards a potential European flood impact database. *EEA – JRC – ETC/CCA Joint Technical Paper*.

MunichRE, N. (2014). Loss events worldwide 2014 Percentage distribution

UNISDR (2011). Global Assessment Report on Disaster Risk Reduction. 2011 Global Assessment Report on Disaster Risk Reduction (pp. i–x). Geneva

### Slide 3

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**FC4** Inserire immagine inondazione

Fabio Cian, 2/5/2016

**FC5** grafico munich re su incremento di flood damage

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# Need of a better flood risk assessment?



Institutions demand better understanding of flood risk:

- support climate change **adaptation policies**
- develop robust public **disaster relief funds**
- develop **risk profile** for **financial institutes**
- risk portfolio for **re-insurance companies**
- risk in supply chain for **multinational companies**

Increasing need of **global** flood risk assessment

Sources:

De Moel, H., Jongman, B., Kreibich, H., Merz, B., Penning-Rowsell, E., Ward, P.J., 2015. Flood risk assessments at different spatial scales. Mitig. Adapt. Strateg. Glob. Chang.  
UNIDSR, 2015. Making Development Sustainable: The Future of Disaster Risk Management. Global Assessment Report on Disaster Risk Reduction.

# New Sentinels, new opportunities



Exploitation of **EO Big Data**: Sentinel-1

**More precise flood mapping** for emergency response and economic impact assessment

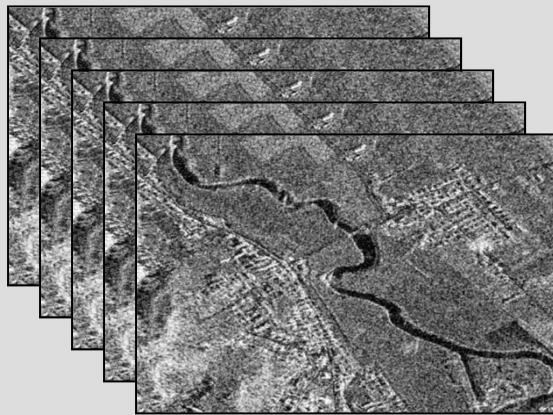
**Evolution** of flood events

Derivation of **Flood Depth**

# Assess the **extent** of a flood event

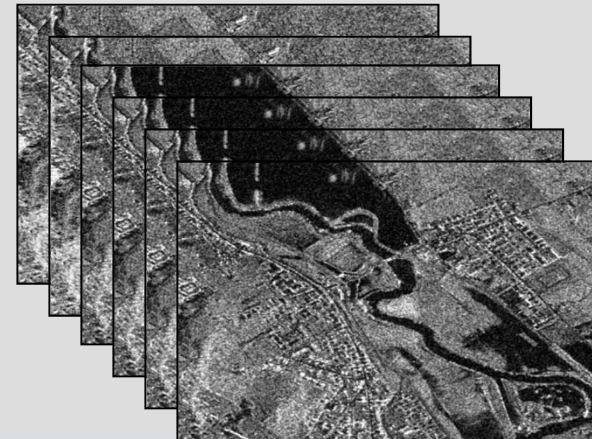


## Compute the Normalized Difference Flood Index



Stack of reference images

*(selection of images in the same weather season)*

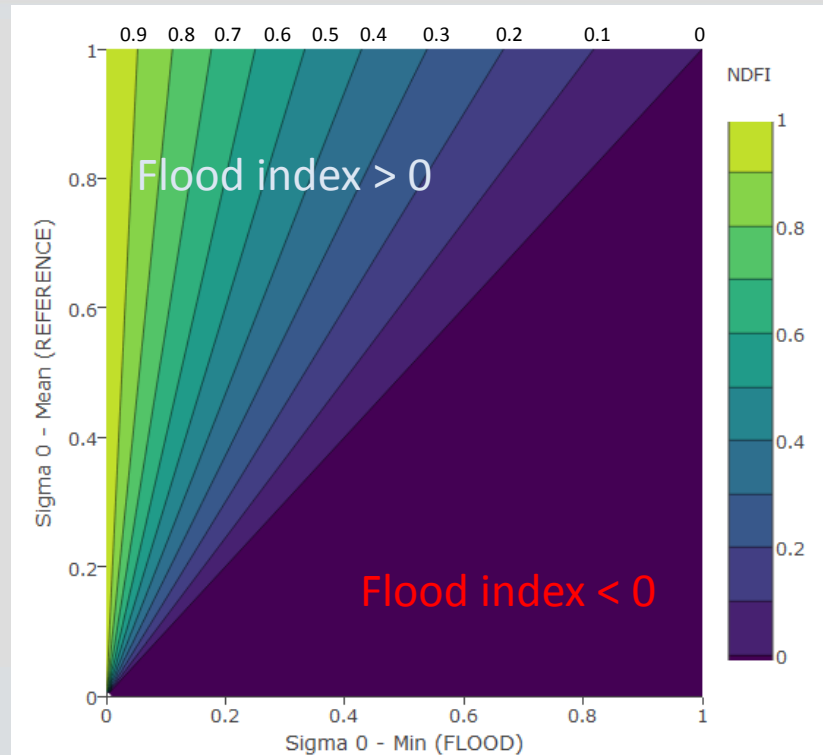


Stack with flood images

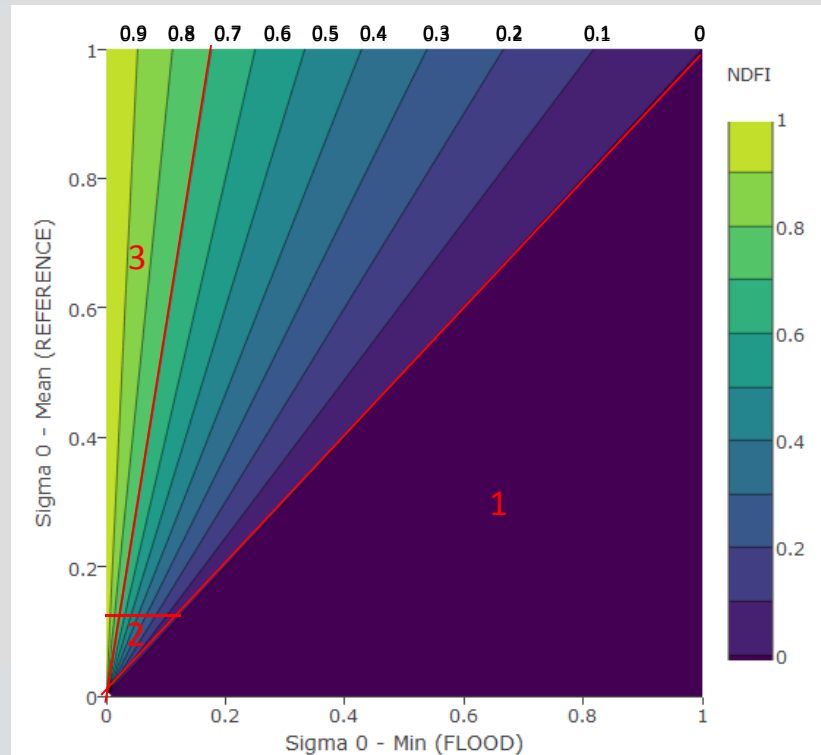
$$NDFI = \frac{(\mathbf{mean\ pixel\ intensity\ (reference)} - \mathbf{min\ pixel\ intensity\ (flood)})}{(\mathbf{mean\ pixel\ intensity\ (reference)} + \mathbf{min\ pixel\ intensity\ (flood)})}$$



# Normalized Difference Flood Index



# Normalized Difference Flood Index

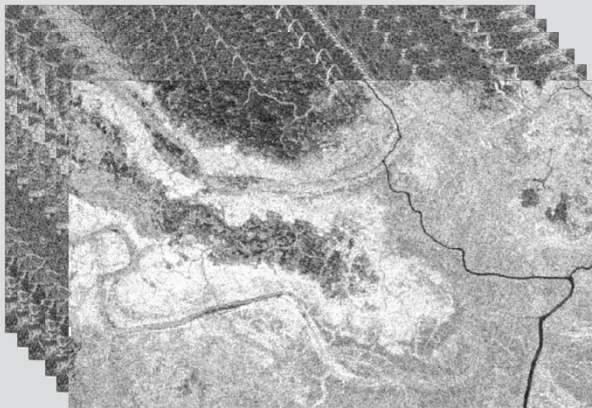


- 1** – unlikely values
- 2** – permanent water bodies
- 3** – flooded areas

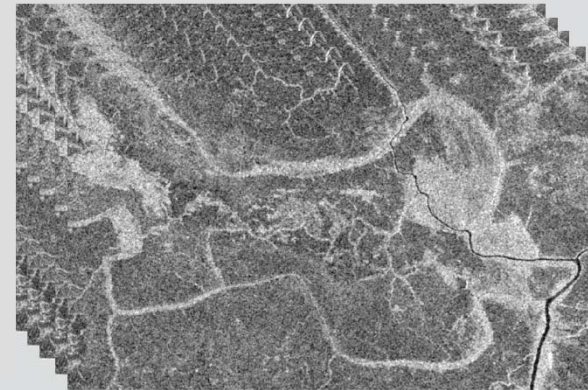
# Shallow Water in Short Vegetation



**Compute the Normalized Difference Flood in Vegetated Areas Index**



Stack with flood images

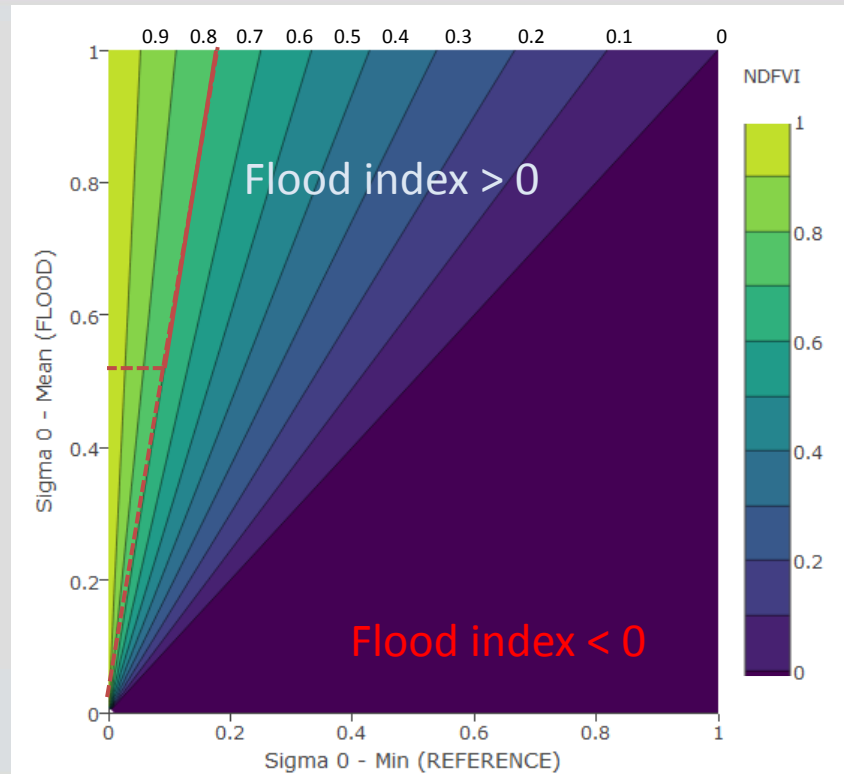


Stack of reference images

*(selection of images in the same weather season)*

$$NDFVI = \frac{(\mathbf{max\ pixel\ intensity\ (flood)} - \mathbf{mean\ pixel\ intensity\ (reference)})}{(\mathbf{max\ pixel\ intensity\ (flood)} + \mathbf{mean\ pixel\ intensity\ (reference)})}$$

# Shallow Water in Short Vegetation



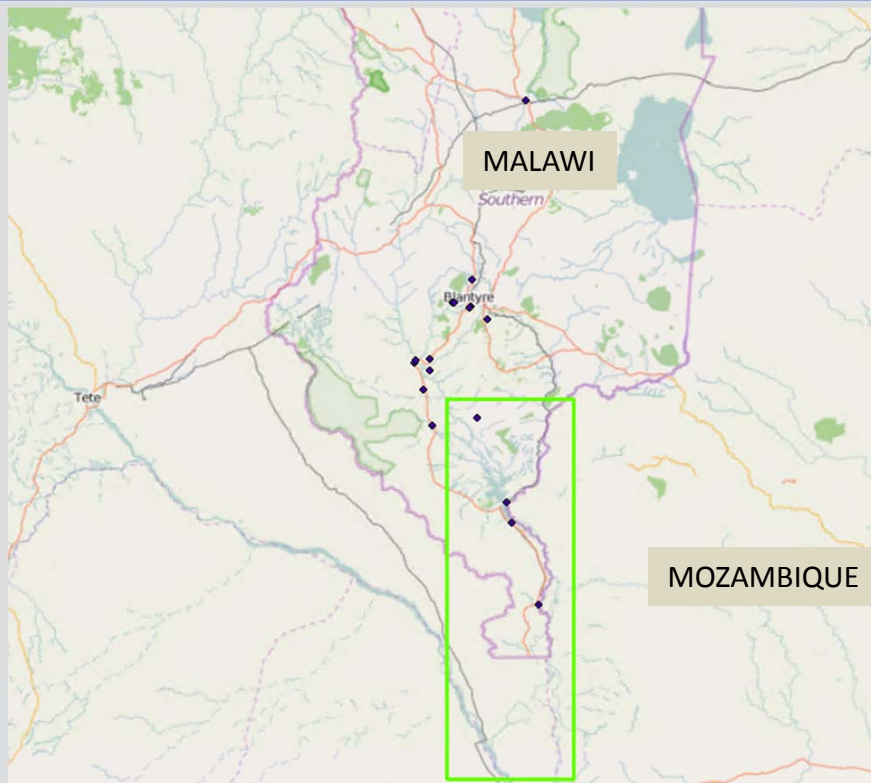
# Flood in Malawi 2015 – Sentinel 1 Data



From beginning of **January** 2015 **heavy rain** caused a big flood in south Malawi, which lasted until the end of March

**276 deaths**  
**174000 displaced**  
**1 million affected**

**Overcrowded** displacement sites  
Concern for rape, cholera, diarrhea, malaria



# Flood in Malawi 2015 – Sentinel 1 Data



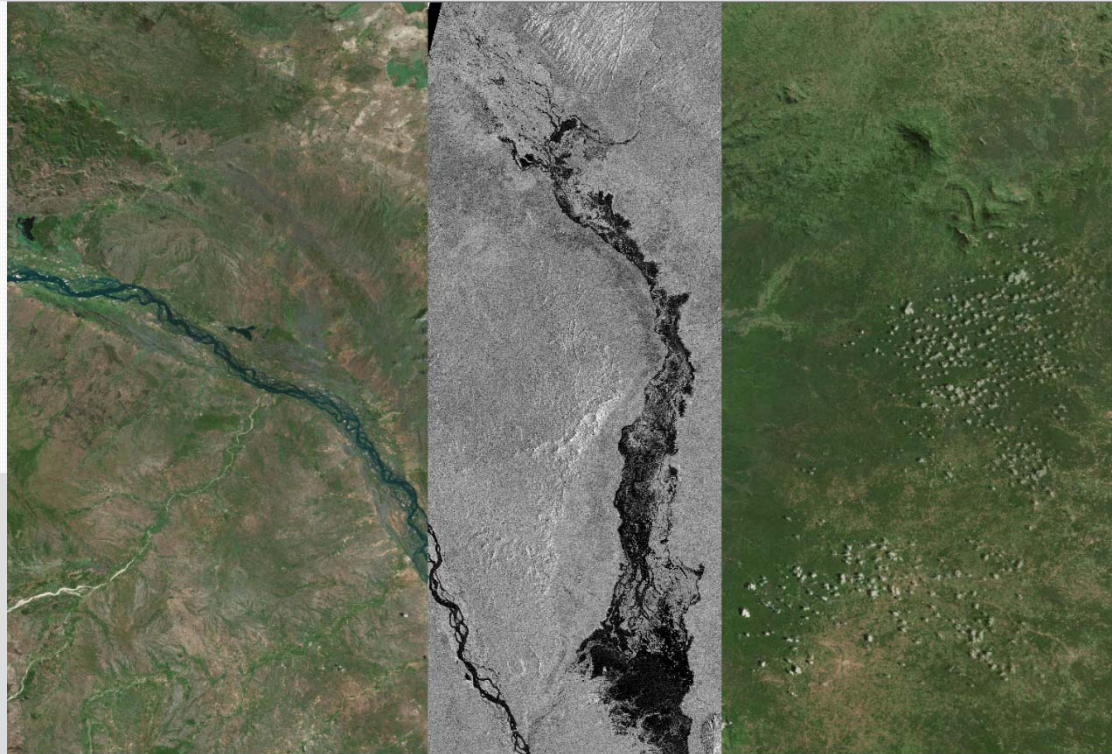
January 22<sup>nd</sup>, 2015

## Sentinel 1 Data

**Descending Orbit  
VV Polarization**

### Reference Images

11 November 2014  
05 December 2014  
29 December 2014



# Flood in Malawi 2015 – Sentinel 1 Data



January 22<sup>nd</sup>, 2015

**NDFI**  
(inverted grayscale)

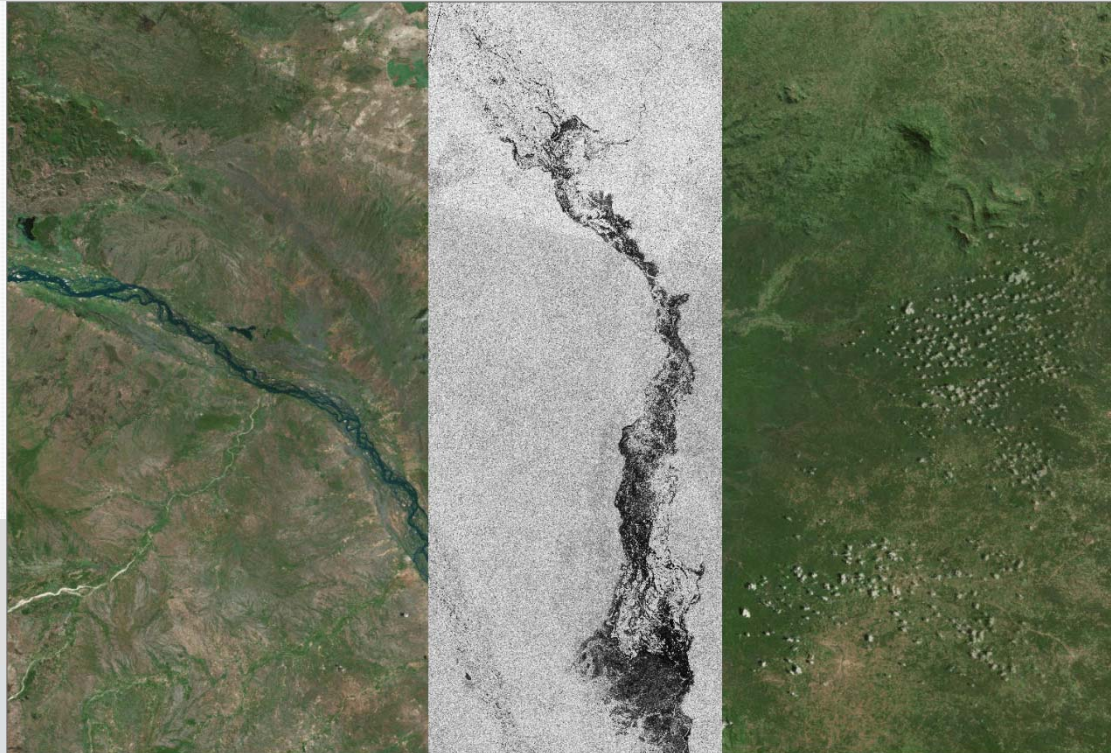
**Descending Orbit**  
**VV Polarization**

**Reference Images**

11 November 2014

05 December 2014

29 December 2014



# Flood in Malawi 2015 – Sentinel 1 Data



January 22<sup>nd</sup>, 2015

**NDFVI**

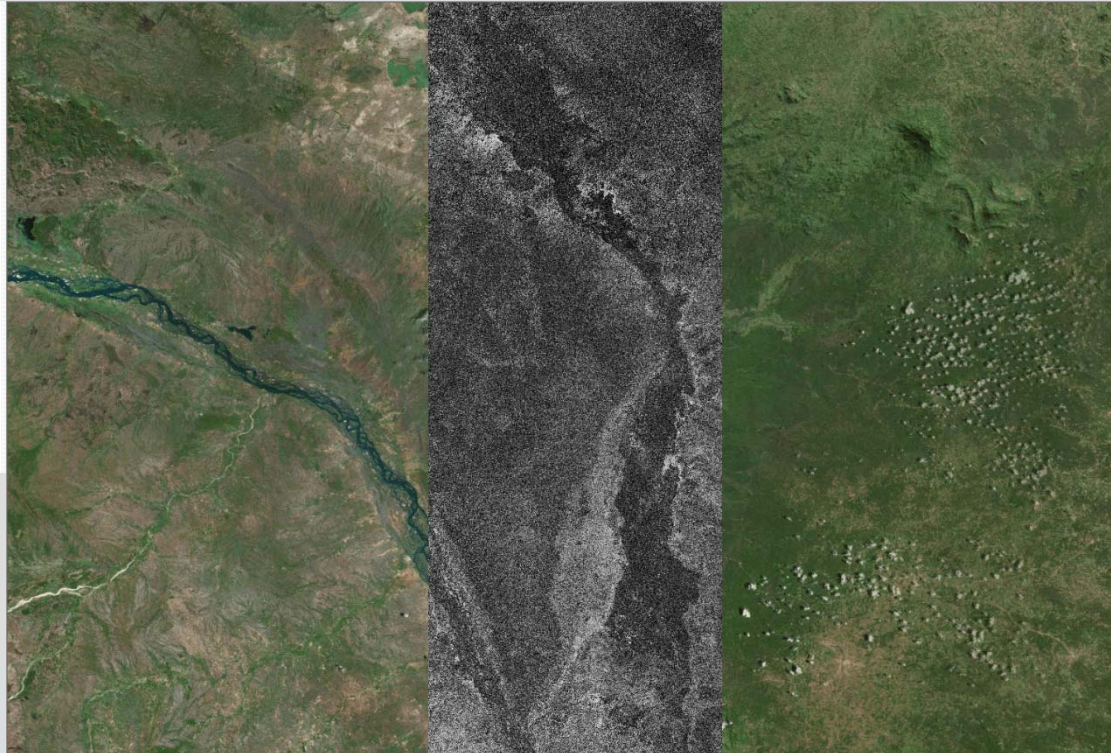
**Descending Orbit  
VV Polarization**

**Reference Images**

11 November 2014

05 December 2014

29 December 2014





# Flood in Malawi 2015 – Sentinel 1 Data





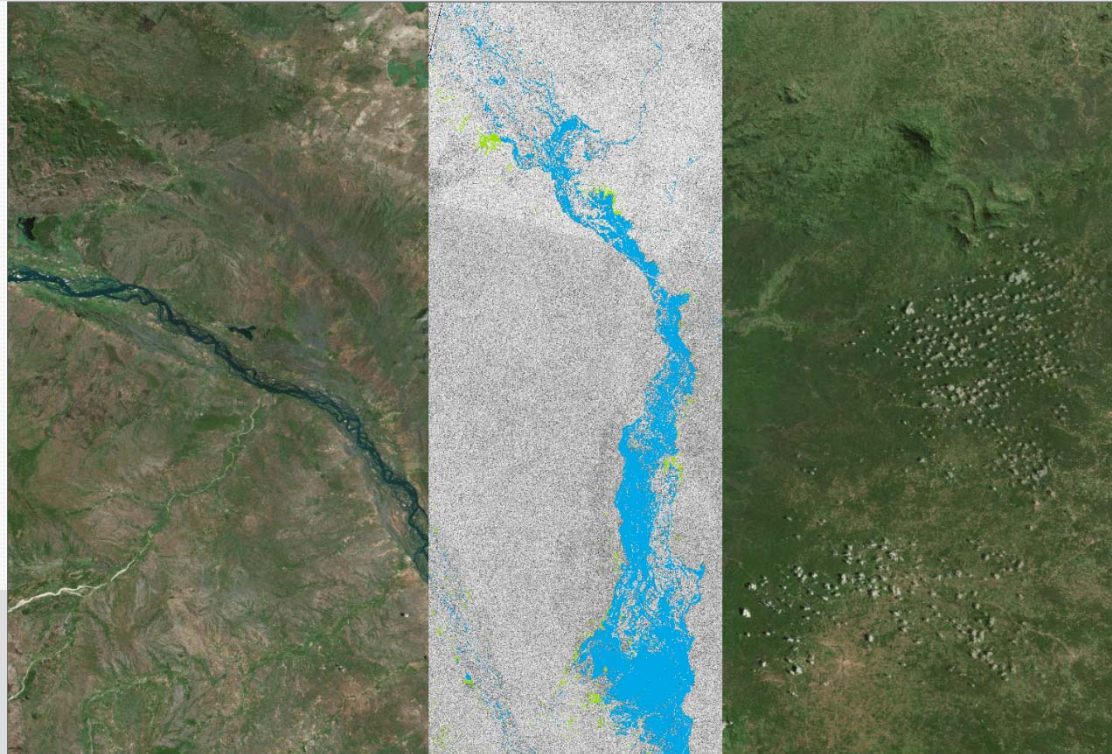
January 22<sup>nd</sup>, 2015

## Flood Map

NDFI > 0.7  
NDFVI > 0.75

Filtered:  
Area < 1000 m<sup>2</sup>  
Elevation --> Slope > 5°

-  Flood
-  Shallow Water  
in Short Vegetation



# Flood in Malawi 2015 – Sentinel 1 Data





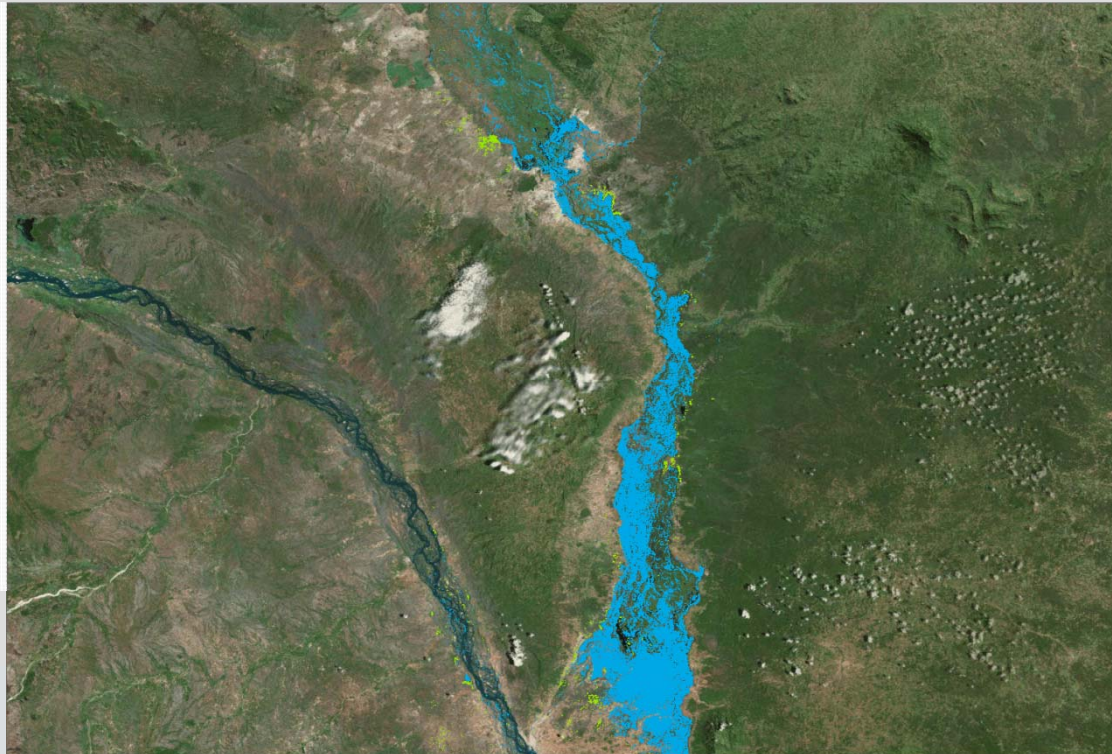
January 22<sup>nd</sup>, 2015

## Flood Map

NDFI > 0.7  
NDFVI > 0.75

Filtered:  
Area < 1000 m<sup>2</sup>  
Elevation --> Slope > 5°

-  Flood
-  Shallow Water  
in Short Vegetation



# Flood in Malawi 2015 – Sentinel 1 Data





February 3<sup>rd</sup>, 2015

## Flood Map

NDFI > 0.7  
NDFVI > 0.75

Filtered:  
Area < 1000 m<sup>2</sup>  
Elevation --> Slope > 5°

-  Flood
-  Shallow Water  
in Short Vegetation



# Flood in Malawi 2015 – Sentinel 1 Data




February 15<sup>th</sup>, 2015

## Flood Map

NDFI > 0.7  
NDFVI > 0.75

Filtered:  
Area < 1000 m<sup>2</sup>  
Elevation --> Slope > 5°

-  Flood
-  Shallow Water  
in Short Vegetation





# Flood in Malawi 2015 – Sentinel 1 Data

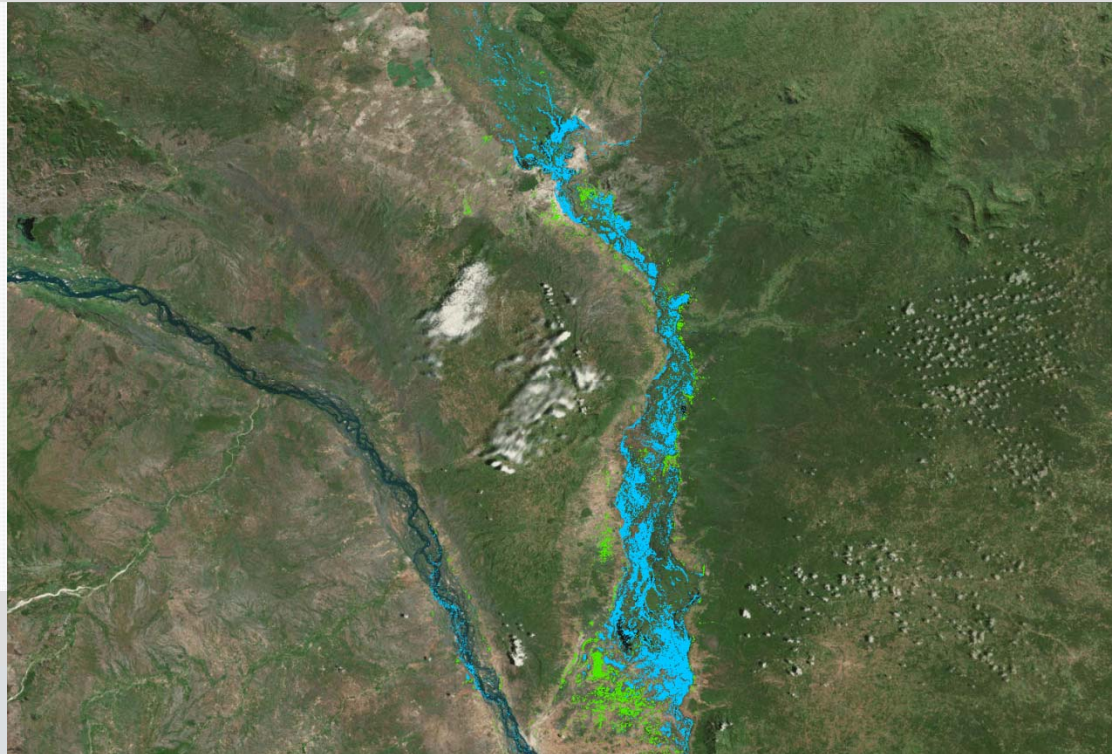


February 21<sup>st</sup>, 2015  
(Ascending Orbit)  
**Flood Map**

NDFI > 0.7  
NDFVI > 0.75

Filtered:  
Area < 1000 m<sup>2</sup>  
Elevation --> Slope > 5°

 Flood  
 Shallow Water  
in Short Vegetation



# Flood in Malawi 2015 – Sentinel 1 Data




February 27<sup>th</sup>, 2015

## Flood Map

NDFI > 0.7  
NDFVI > 0.75

Filtered:  
Area < 1000 m<sup>2</sup>  
Elevation --> Slope > 5°

-  Flood
-  Shallow Water  
in Short Vegetation



# Flood in Malawi 2015 – Sentinel 1 Data





March 23<sup>rd</sup>, 2015

## Flood Map

NDFI > 0.7  
NDFVI > 0.75

Filtered:  
Area < 1000 m<sup>2</sup>  
Elevation --> Slope > 5°

-  Flood
-  Shallow Water  
in Short Vegetation



# Flood in Malawi 2015 – Sentinel 1 Data





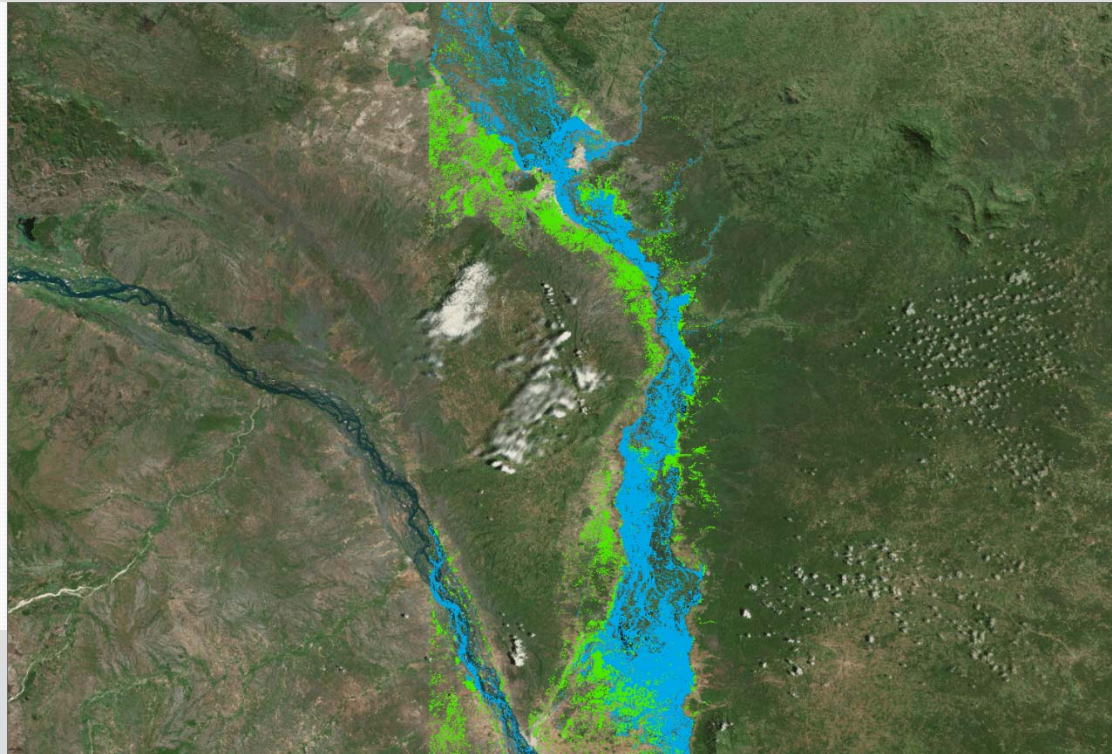
Overall Flood from  
January until March

## Flood Map

NDFI > 0.7  
NDFVI > 0.75

Filtered:  
Area < 1000 m<sup>2</sup>  
Elevation --> Slope > 5°

-  Flood
-  Shallow Water  
in Short Vegetation





# Flood in Malawi 2015 – Sentinel 1 Data

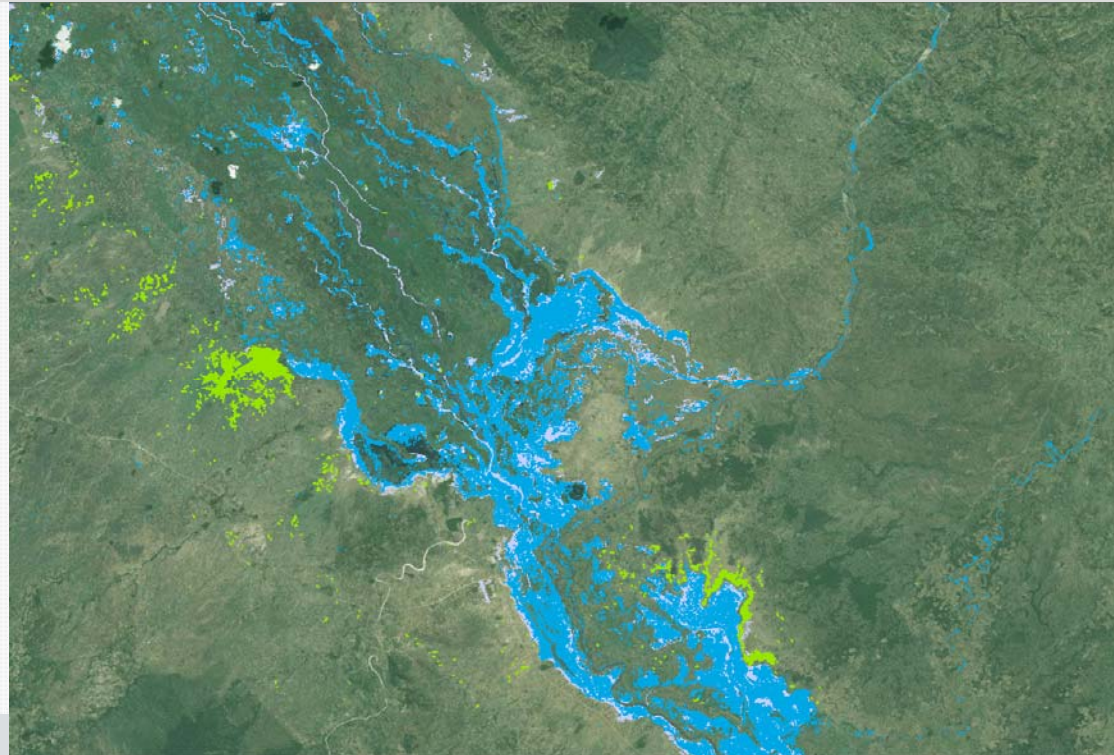


22 January – Comparison  
with Copernicus Products

## Flood Map (Detail, Bangula)

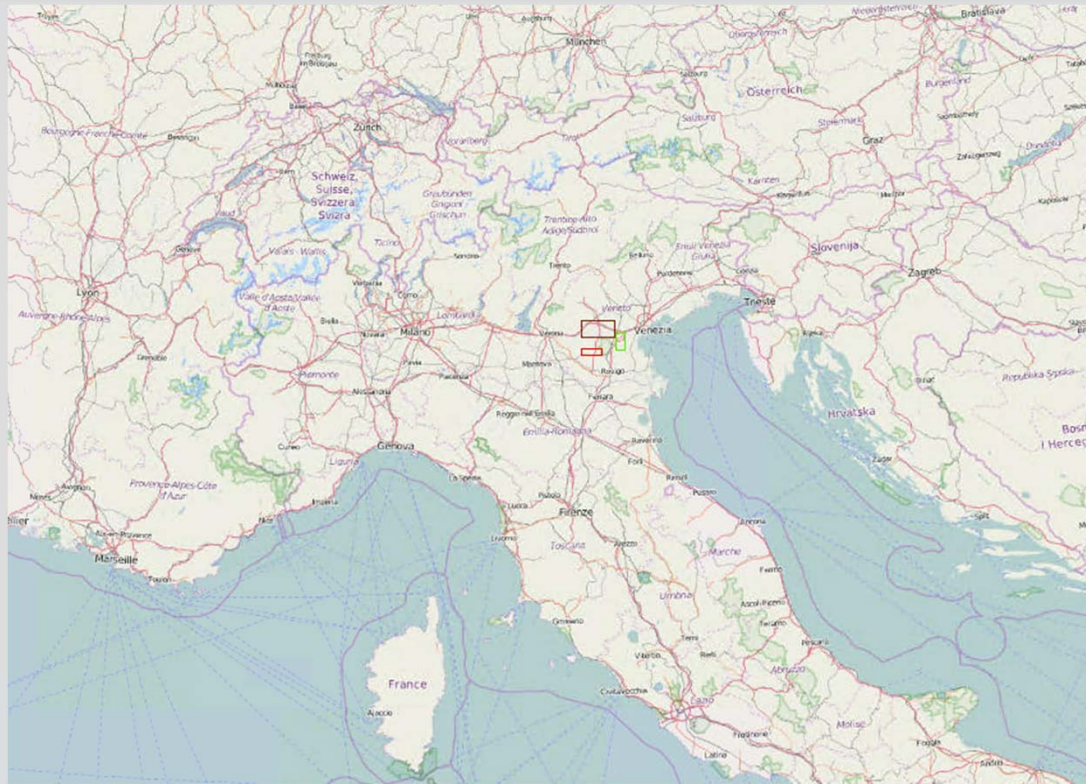
NDFI > 0.7  
NDFVI > 0.75

Filtered:  
Area < 1000 m<sup>2</sup>  
Elevation --> Slope > 5°



- Flood
- Shallow Water  
in Short Vegetation
- Flood - Copernicus

# Flood in Venice 2010



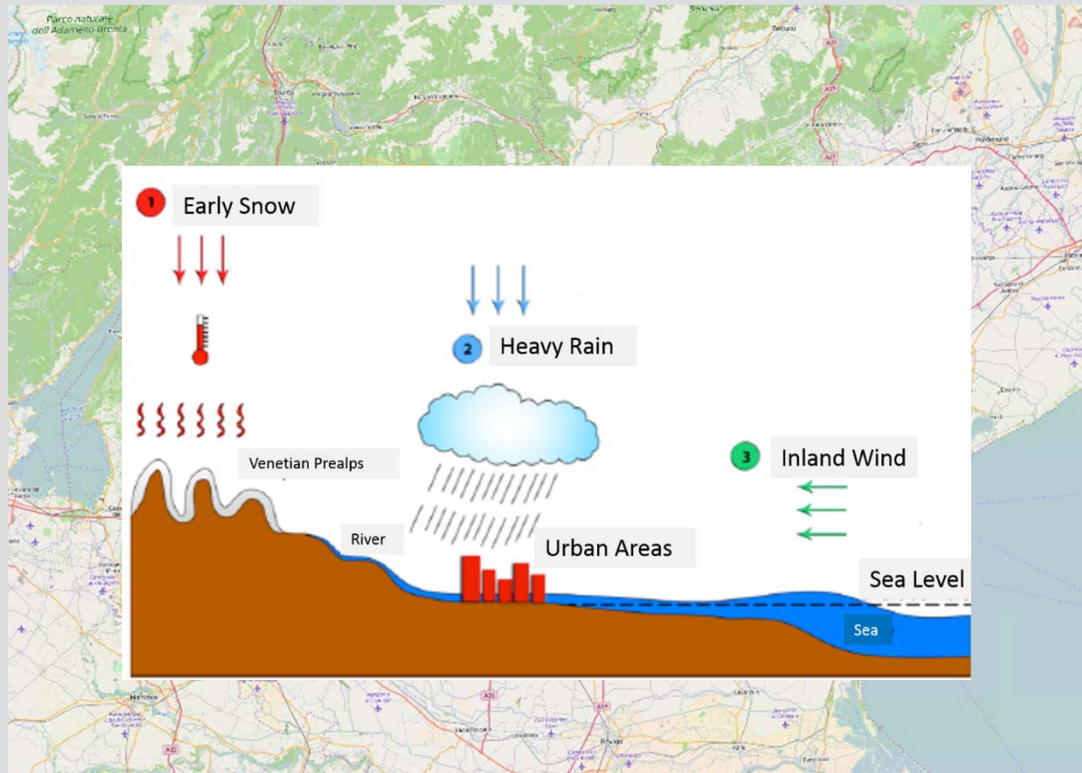
# Flood in Venice 2010



Early snow in late October led to excessive runoff from the pre-alpine region

Heavy rain over urban areas

Wind to the south prevent rivers to discharge properly in the Venetian lagoon



# Flood in Venice 2010



**November 1<sup>st</sup> 2010**  
**CSK**  
**3 meters**

**Few hours before  
the event**

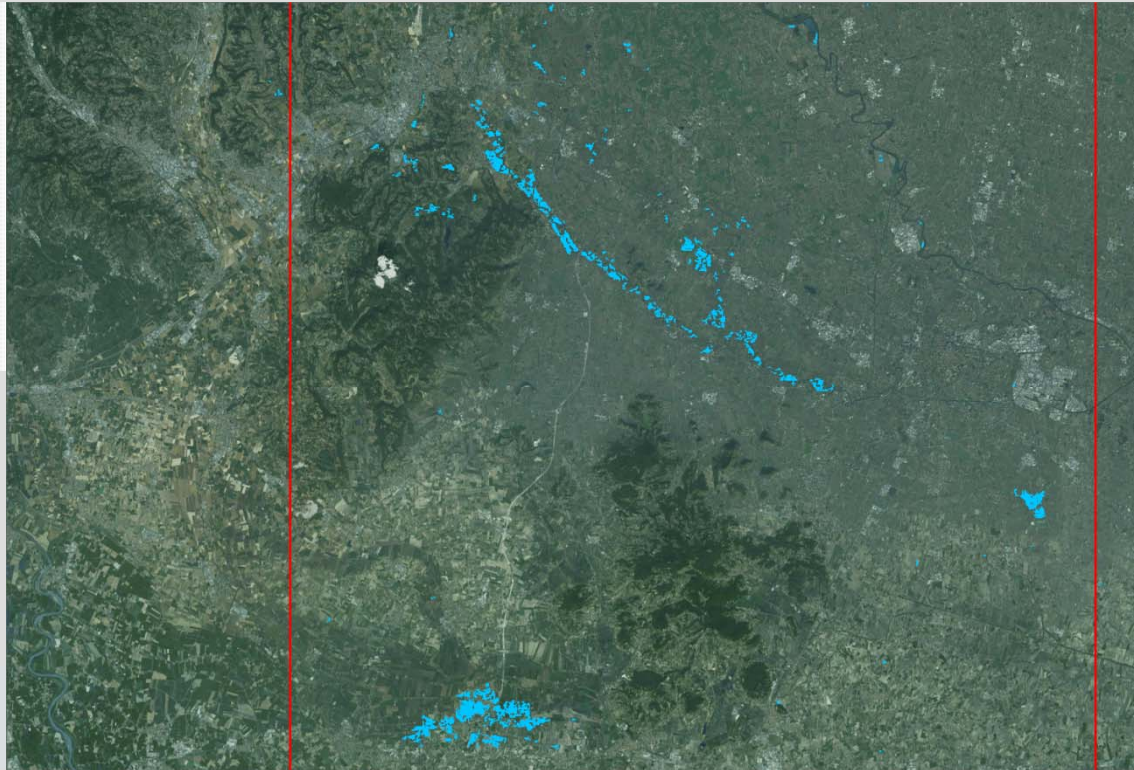


# Flood in Venice 2010



November 2<sup>nd</sup>  
2010, RADARSAT 2  
25 meters

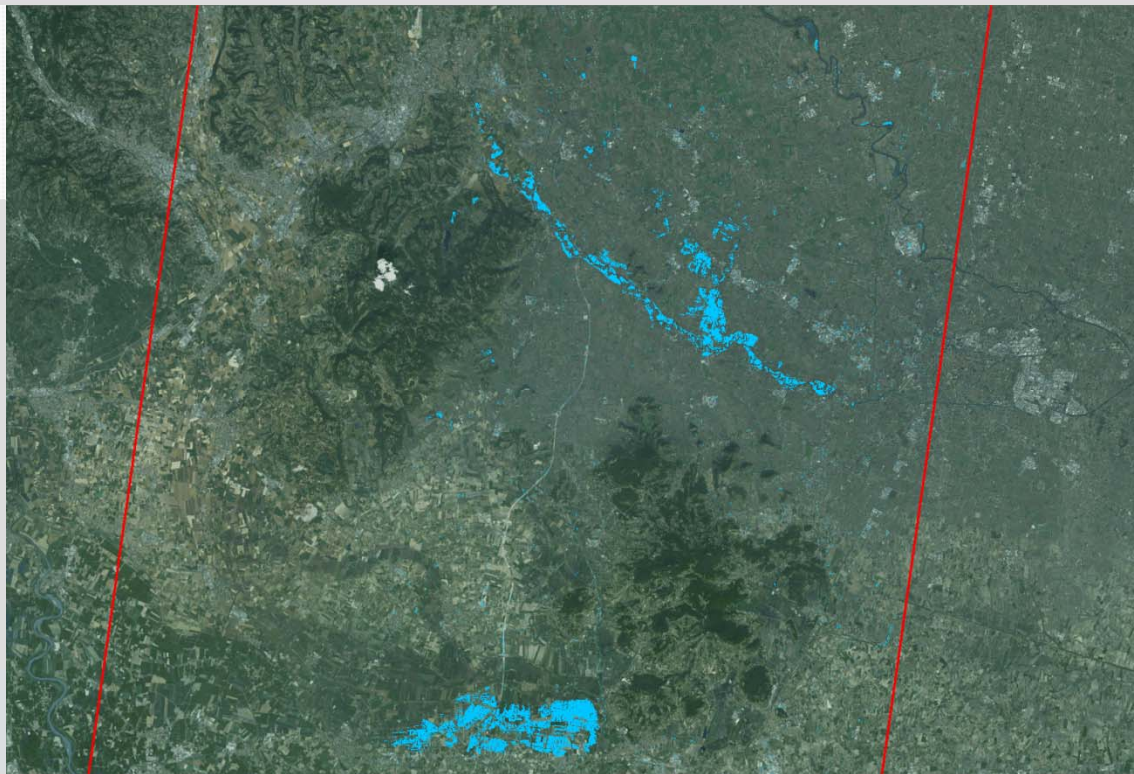
First Image after  
the flood peak



# Flood in Venice 2010



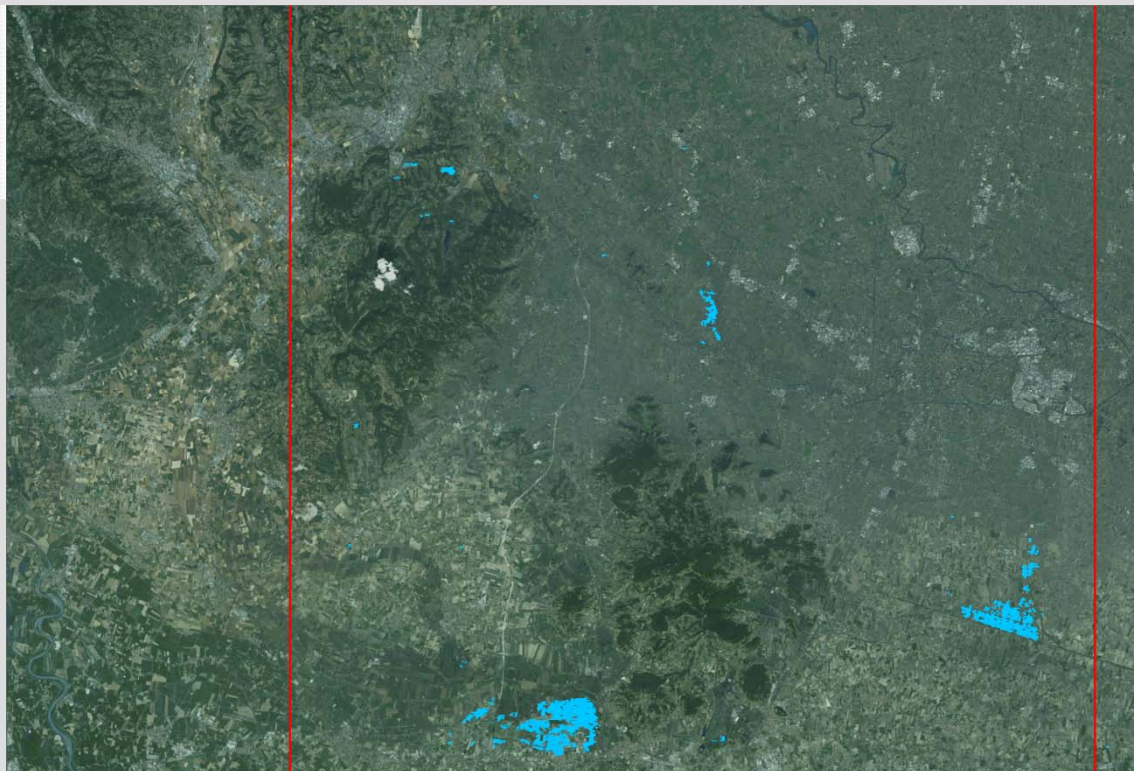
November 3<sup>rd</sup>  
2010, CSK  
3 meters



# Flood in Venice 2010



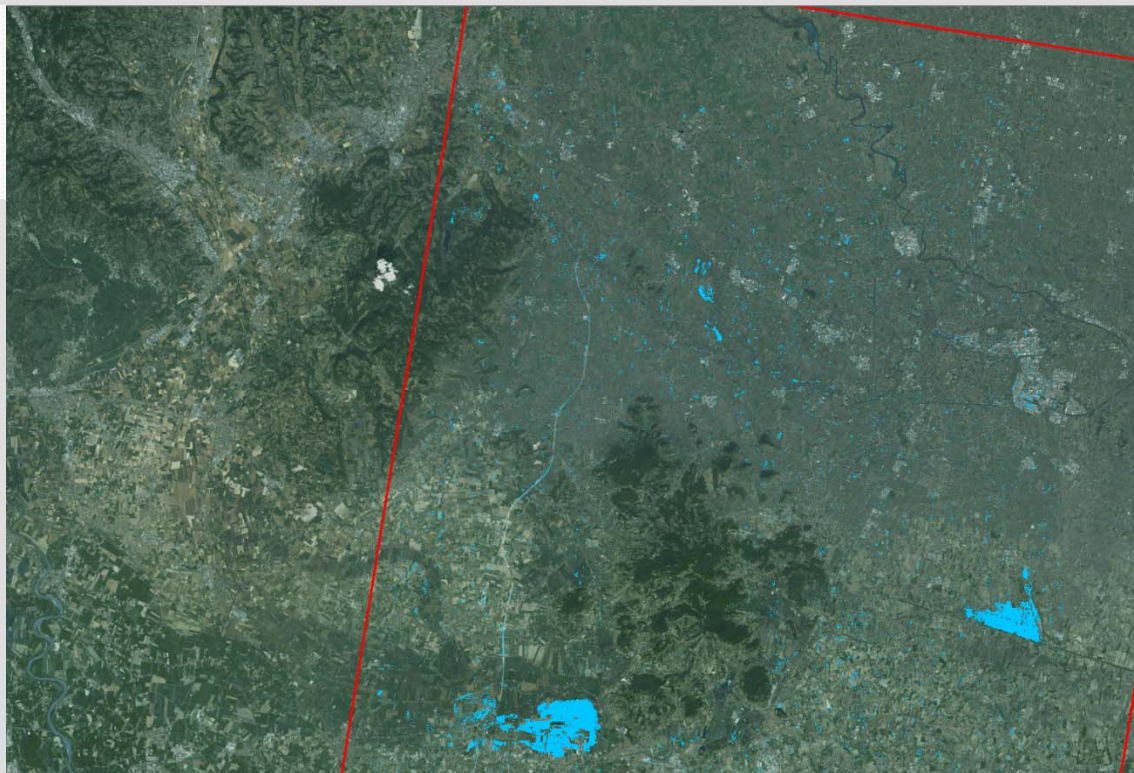
November 5<sup>th</sup>  
2010, RADARSAT 2  
25 meters



# Flood in Venice 2010



November 6<sup>th</sup>  
2010, CSK  
3 meters

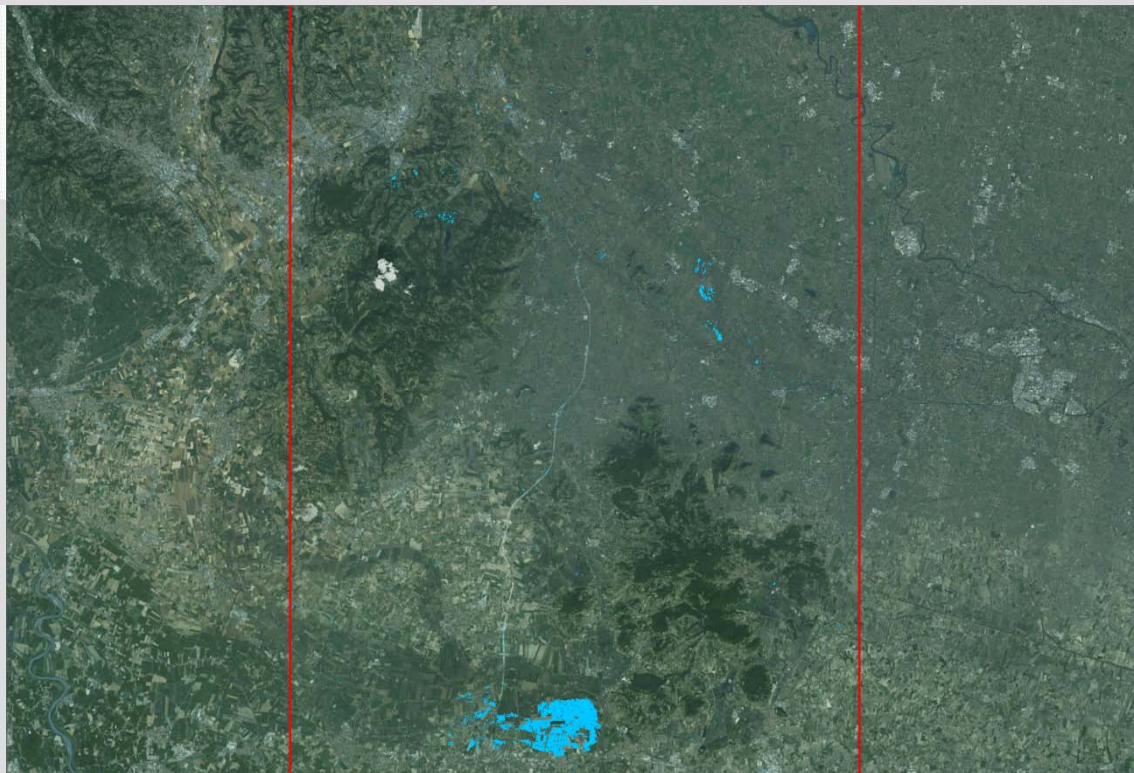




# Flood in Venice 2010



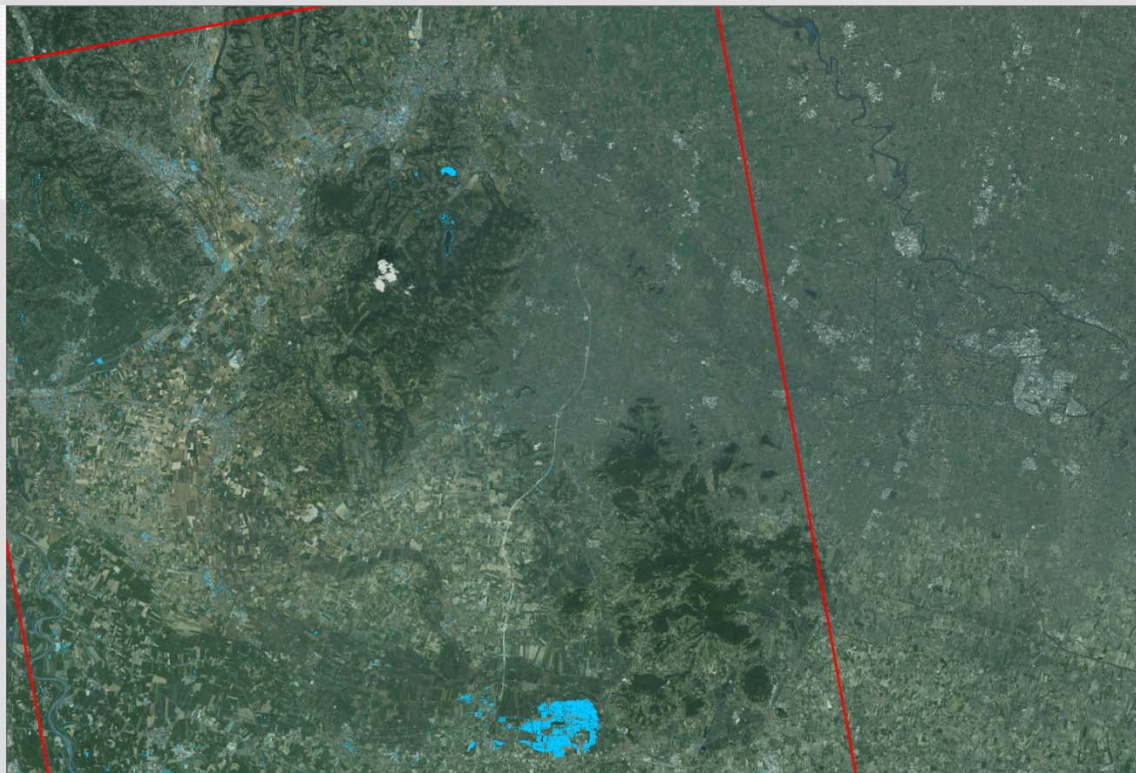
November 6<sup>th</sup>  
2010, TSX  
3 meters



# Flood in Venice 2010



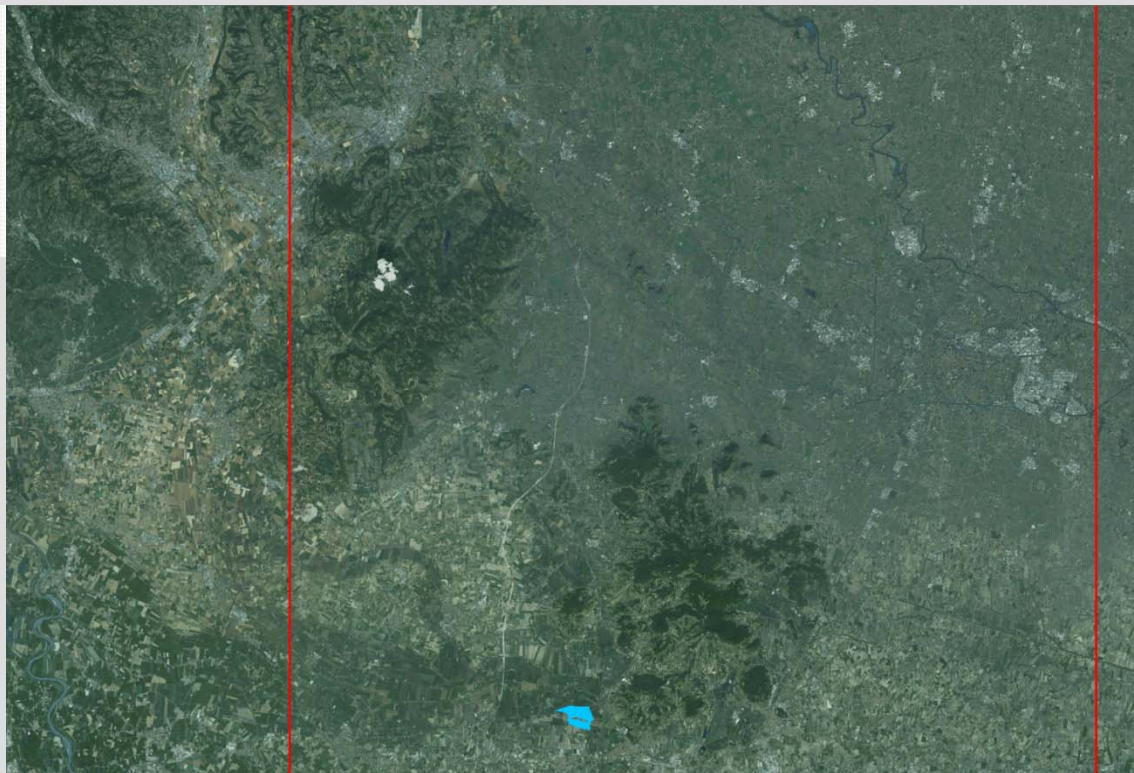
November 7<sup>th</sup>  
2010, CSK  
3 meters



# Flood in Venice 2010



November 12<sup>th</sup>  
2010, ENVISAT  
ASAR  
150 meters

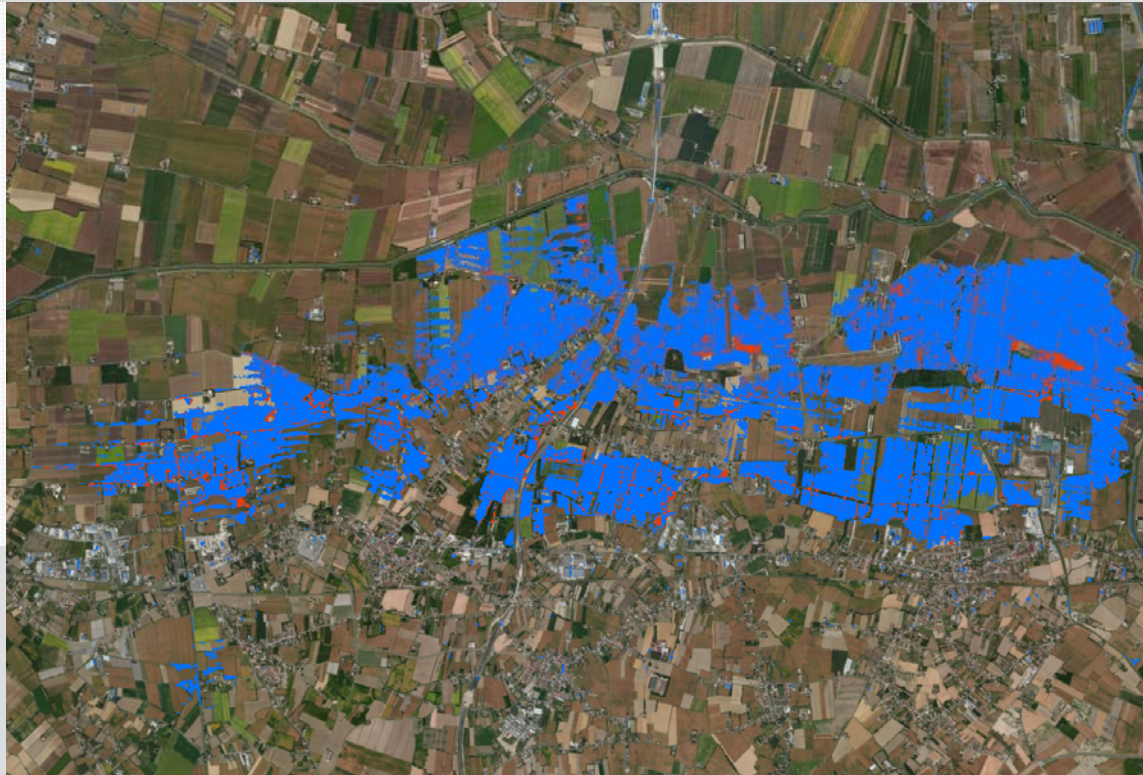


# Flood in Venice 2010



November 3<sup>rd</sup> 2010  
CSK 3 meters  
(Detail, Saletto)

Comparison with  
maps produced by  
**CIMA Foundation**  
for the Italian civic  
protection (**red**)

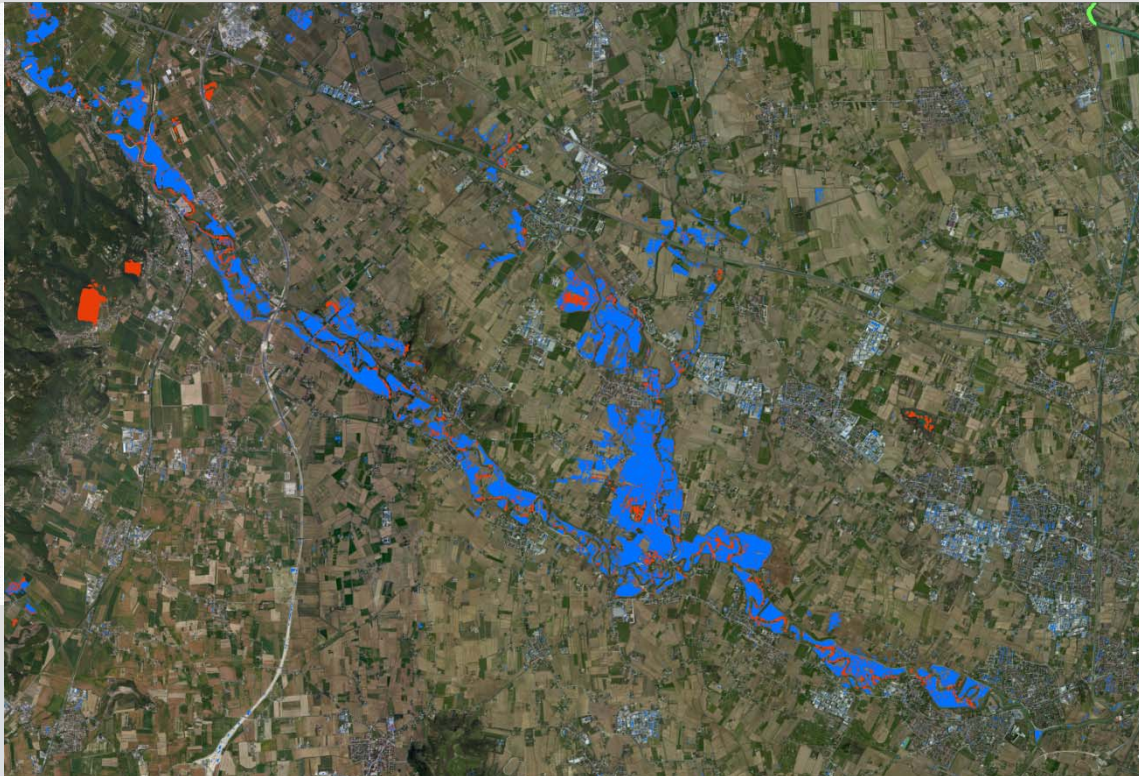


# Flood in Venice 2010

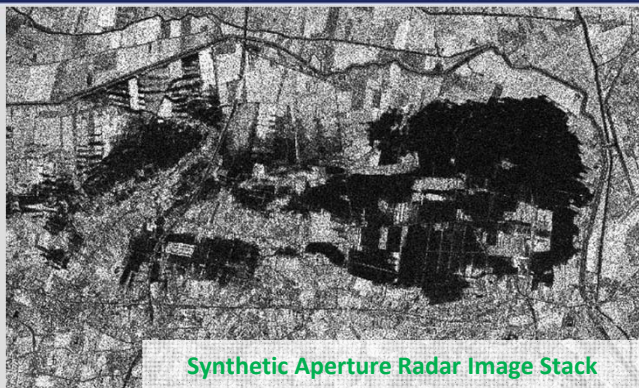


November 3<sup>rd</sup> 2010  
CSK 3 meters  
(Detail, South of  
Vicenza)

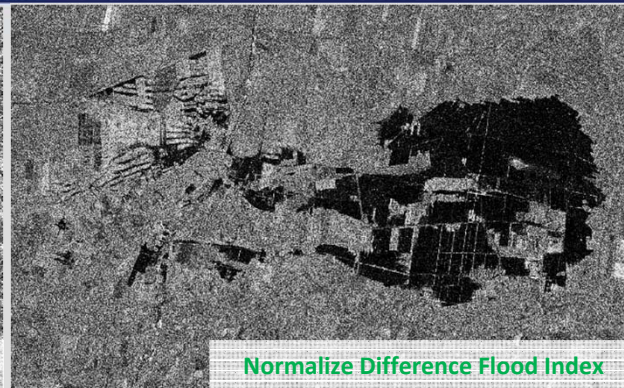
Comparison with  
maps produced by  
**CIMA Foundation**  
for the Italian civic  
protection (**red**)



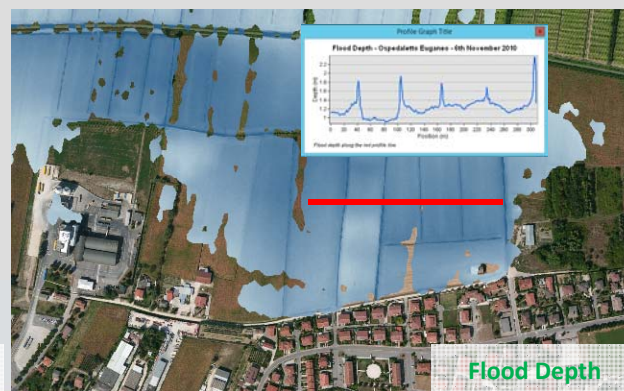
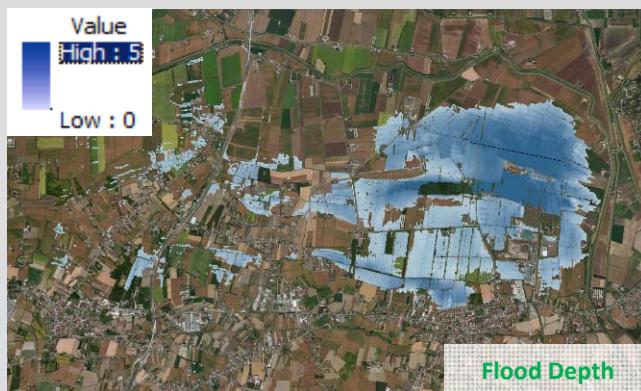
# Flood in Venice 2010 – Flood Depth Estimation



Synthetic Aperture Radar Image Stack



Normalize Difference Flood Index



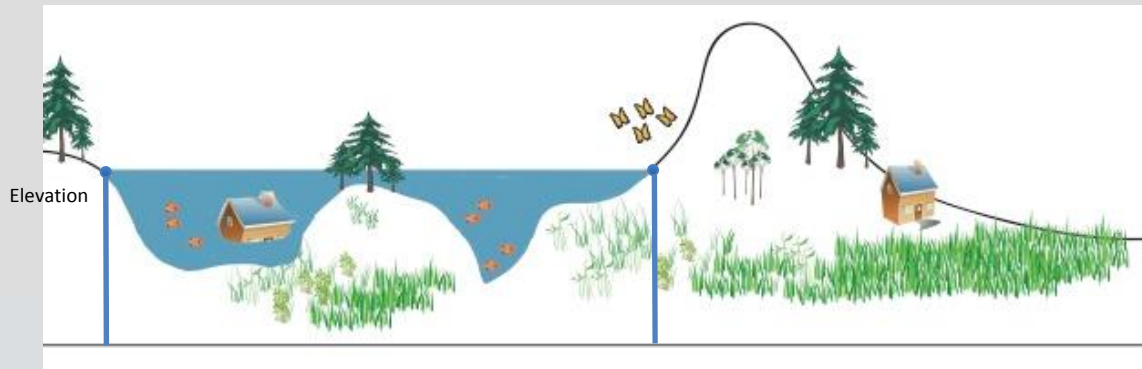
# Flood in Venice 2010 – Flood Depth Estimation



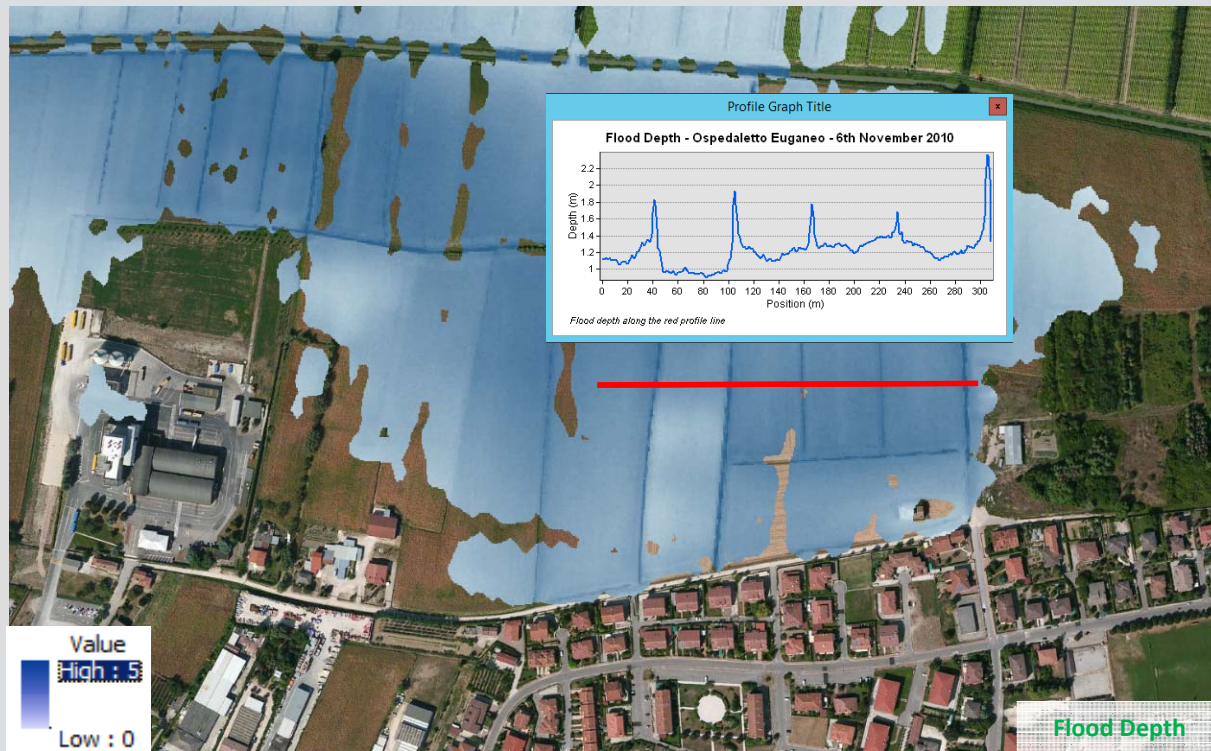
Hypothesis: water surface is a **plane** (true almost always)

If flood map is accurate, the elevation along the contour of each flooded area should be the same (there are exceptions)

Detect the **maximum elevation (95<sup>th</sup> percentile)** along the contour to compute flood depth



# Flood in Venice 2010 – Flood Depth Estimation





# Conclusions



Easy and precise flood mapping

- Thanks to EO Big Data: Sentinels

Fast mapping good for **emergency response** thanks to the methodology developed

Precise **Flood Depth estimation** possible when a high resolution DEM is available

Flood dynamics/evolution thank to frequent acquisition

Improvement for economic impact assessment