

## WP6: An automated approach to estimate flood volumes based on SAR satellite imagery and DEMs

Hendrik Zwenzner

DLR

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# Objectives

- Establish a method for flood volume estimation for large scale floods based on EO data and DEMs
  - Higher level product compared to 2-D flood masks
  - Can be compared to gravity measurements from space
- Implement gravity based flood indicators into the operational workflow of DLR's Center for Satellite-based Crisis Information
  - Early-warning component for potential large scale flood events
  - Reduce lead time in satellite tasking (e.g. TerraSAR-X)

# Introduction

- Flood depth & volume estimations are mostly done by **hydraulic modelling** (1-D, 2-D)
    - > BUT the more complex & precise they get :
      - computational cost increases
      - study areas get smaller
      - more input parameters are needed
- ➔ **sometimes complex hydraulic models are not suitable for real-world flood risk analysis (BATES 2012)**

BATES (2012:2515) „... argued that the use of **remote sensing data** had allowed a **significant breakthrough** to be made in flood inundation modelling.“

- > in terms of higher resolutions, shorter revisit times, better availability
- > improving terrain data resolution leads to better performances than improving the hydraulic model!

# Flood volumes without hydraulic modelling

but with improved remote sensing data?

Few publications tried to estimate flood volumes only with remote sensing data or a combination of RS data and hydraulic modelling before:

- HORRIT 1999: **Snake algorithm** for delineation
- NÉELZ et al 2006: **Airborne SAR data & LiDAR**, inundation extent delineation
- MASON et al. 2007: **Waterline delineation** with ERS SAR & LiDAR, hydraulic model
- MATGEN et al. 2007: SAR water mask extent, hydraulic modelling for flood depths
- ZWENZNER & VOIGT 2009: heights from **cross sections** for each river bank
- SCHUMANN et al. 2009: Flood depths from airborne photography and LiDAR, **SAR too coarse**
- KAWAK et al. 2013 flood volume & depths modeled with 1-D hydraulic model, **optical data**, low resolution (500 m)
- HUANG et al. 2014: inundation extent & LiDAR => **shift small tiles till they fit the DEM**

=> So far no study for large scale flood volumes & depths derived from SAR derived flood masks & DEMs with world wide coverage

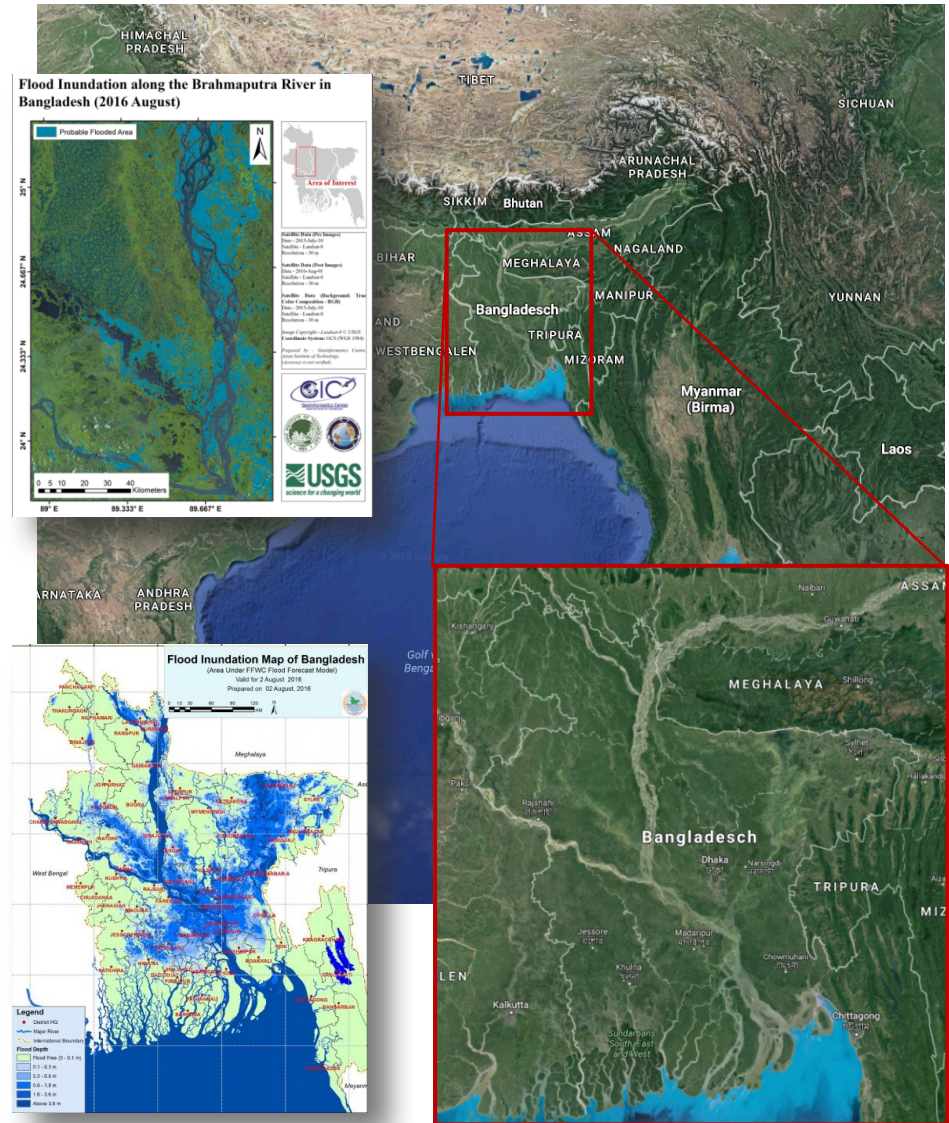
# Study Area: Bangladesh

- Seasonal flooding due to monsoonal precipitation
- Regular Charter activations
- Huge affected area

## Selected Event:

Activation of the International Charter on 1<sup>st</sup> of August 2016

- 16 people killed
- 1.5 million people affected
- flooding of Ganges and Brahmaputra due to heavy rainfalls for several days

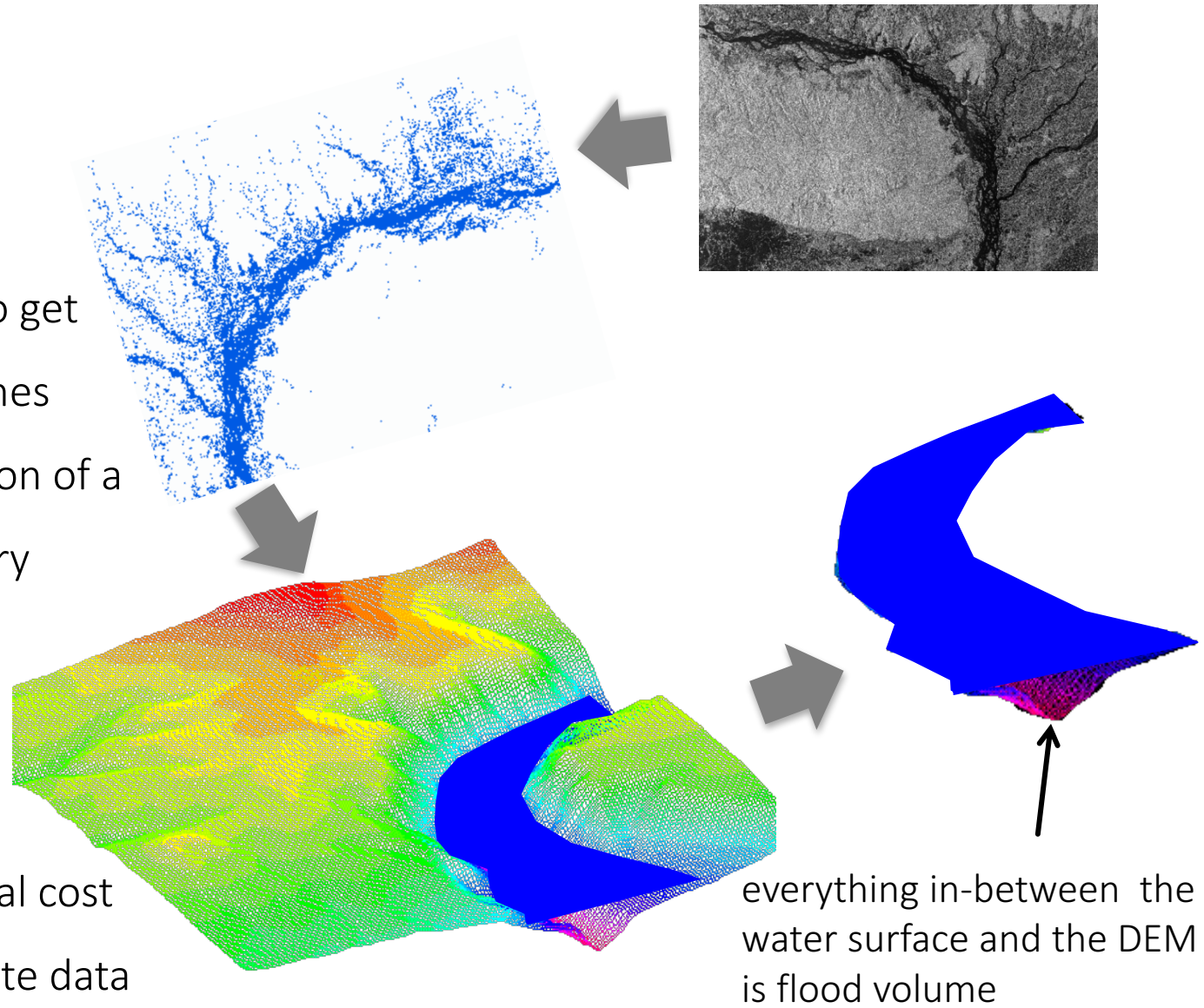


# Method

Develop a method to get accurate flood volumes through a combination of a DEM and SAR imagery

## Important criteria:

- low computational cost
- usage of up to date data

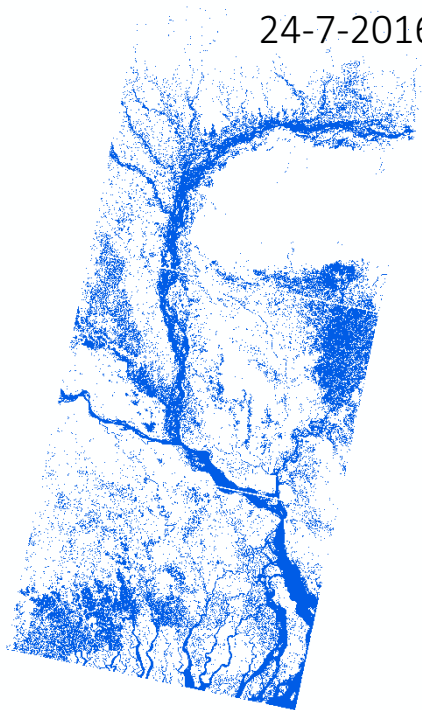


# Input data

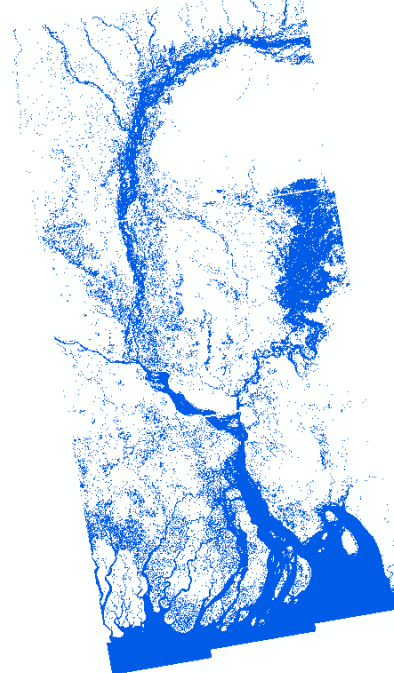
## Flood Masks

- Sentinel-1 Scenes (SAR-Data) for Pre- & Post-Flooding, time-series
- ENVISAT ASAR

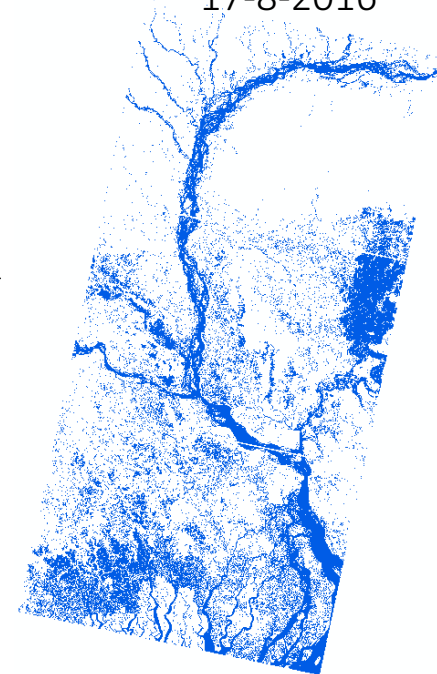
Pre-Flood  
24-7-2016



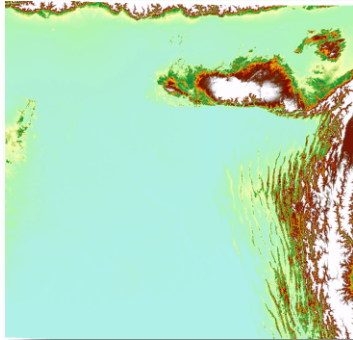
Post-Flood  
03-8-2016



Post-Flood  
17-8-2016

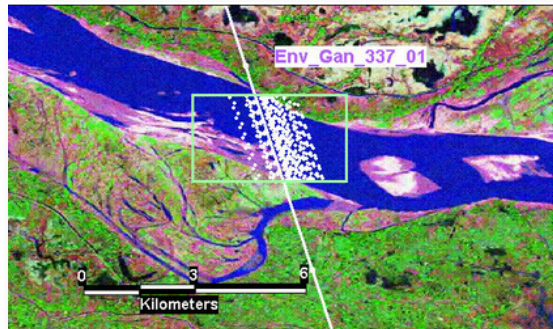


# Input data



## Digital Elevation Models (DEM)

- SRTM 30 m integer
- SRTM 30 m interpolated to 32-bit float (still height artefacts)
- TanDEM-X 30 m 32-bit float (Proposal submitted)



## Gauge Validation Data

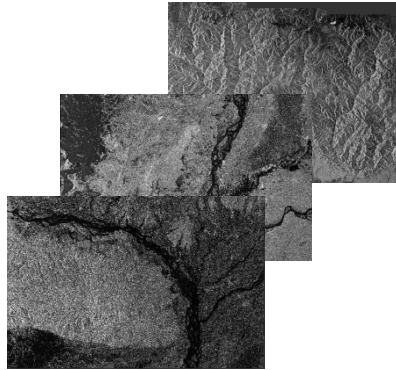
- Water level data for automatic in situ stations from the Bangladesh Water Development Board (BWDB)
- Altimeter data from Jason-2 for virtual gauges

[www.legos.obs-mip.fr](http://www.legos.obs-mip.fr)

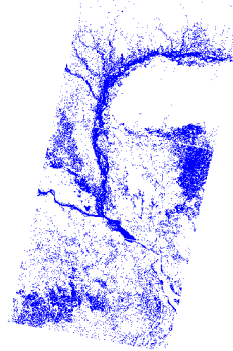


# Workflow

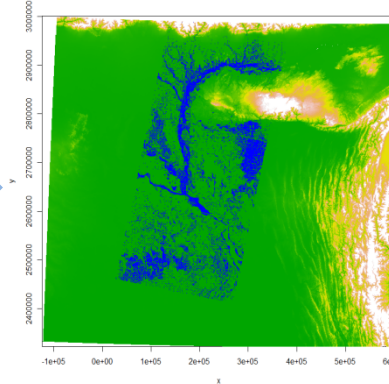
Pre-Processing of Sentinel-1 Scenes



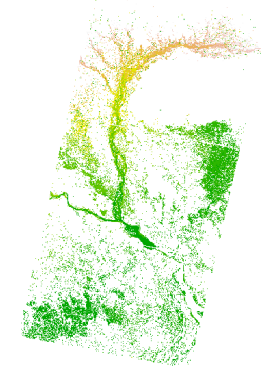
Water classification  
Sentinel-1 Flood Processor (ZKI)



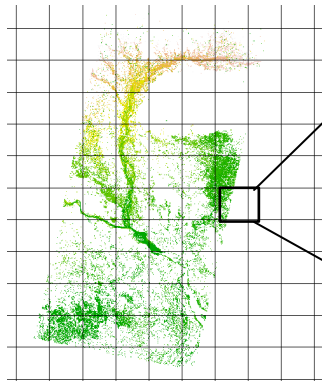
Clip DEM with  
water mask



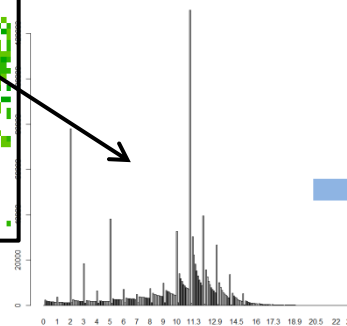
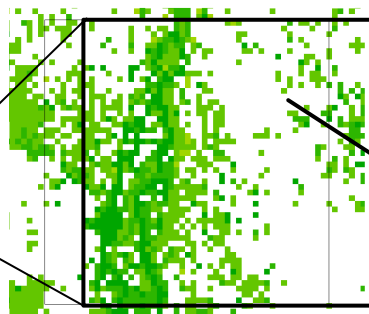
Only height information for  
flooded pixels remains



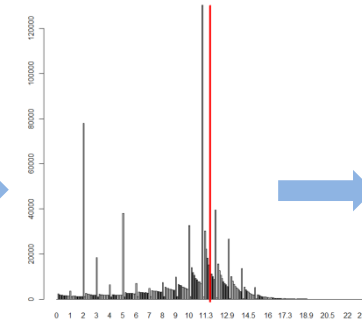
overlay with grid



create histogram  
for each grid cell



Apply individual  
threshold

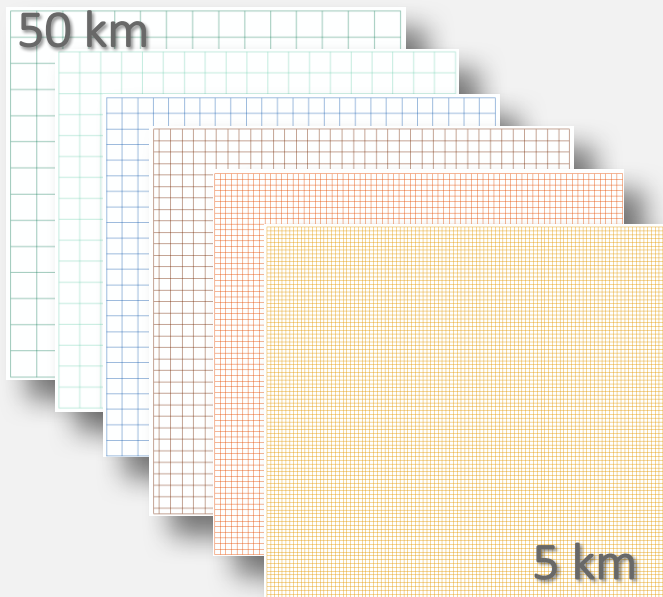


sum of the volume of  
each flooded pixel

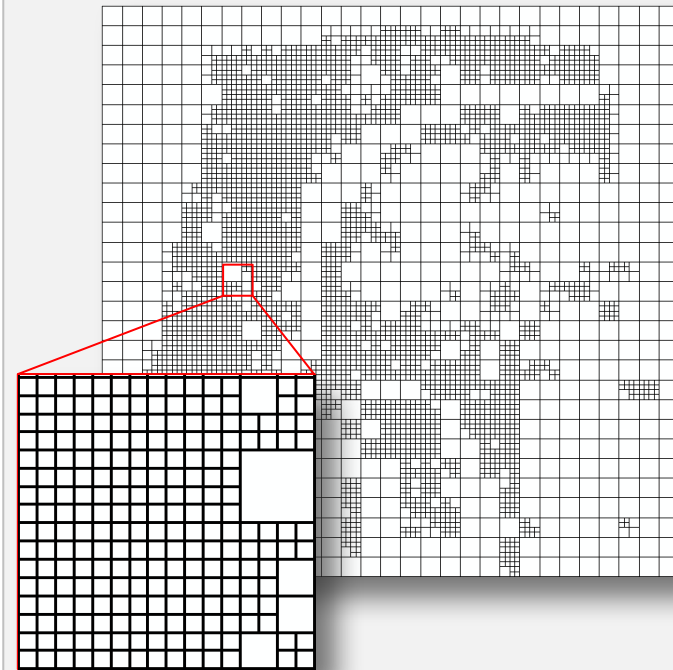
Volume  
**12,518 Gt**

# Raster approach

**Classic Fishnet**  
with different cell sizes



**Sub-Tiles**  
created by slope-dependent threshold



## Threshold I apprupt change

Histogram for  
one grid cell

DEM values  
=> height information

	07.09.07
	Gan_524
	OID_3909
1	0
2	0
3	2000
4	3111
5	3046
6	198
7	139
8	439
9	285
10	371
11	673
12	320
13	354
14	355
15	377
16	341
17	184
18	279
19	63
20	27
21	28
22	15
23	10

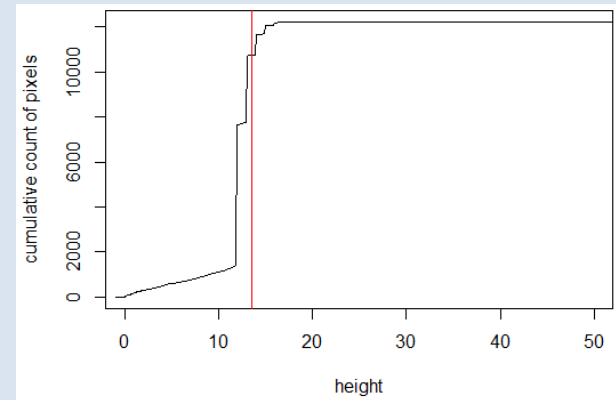
WATER

get the point of  
drastic change  
=> **Water height  
is 5 m**

EXCLUDED PIXELS

## Threshold II cummulative

1. Sum up the pixel counts of the histogram
2. Set threshold until pixels are included
3. **70 %** of pixels is a good value



=> Still not appropriate for all  
grid cells

## Threshold I apprupt change

Histogram for  
one grid cell

DEM values  
=> height information

	07.09.07
	Gan_524
	OID_3909
1	0
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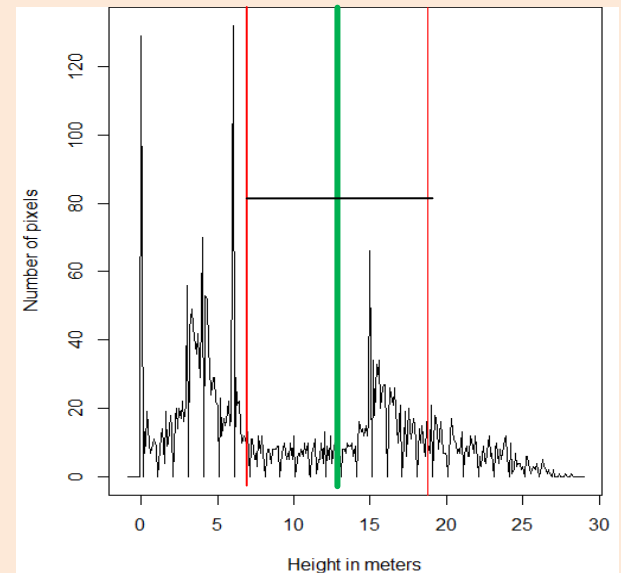
EXCLUDED PIXELS

## Threshold III

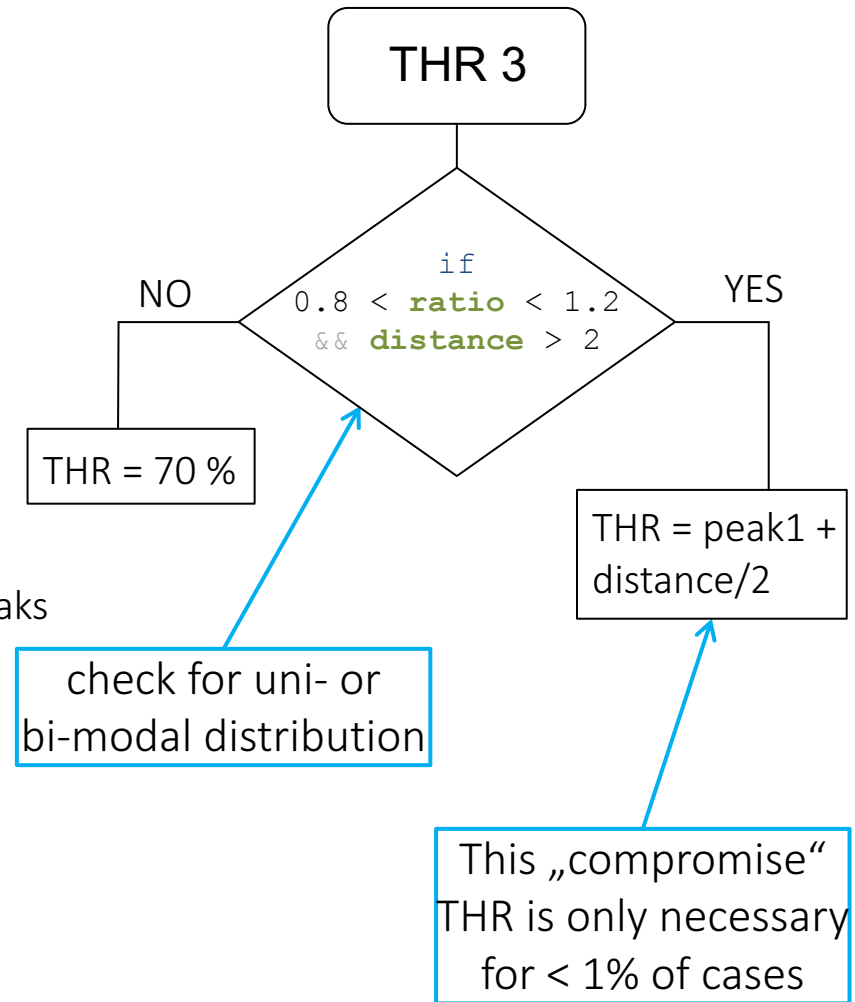
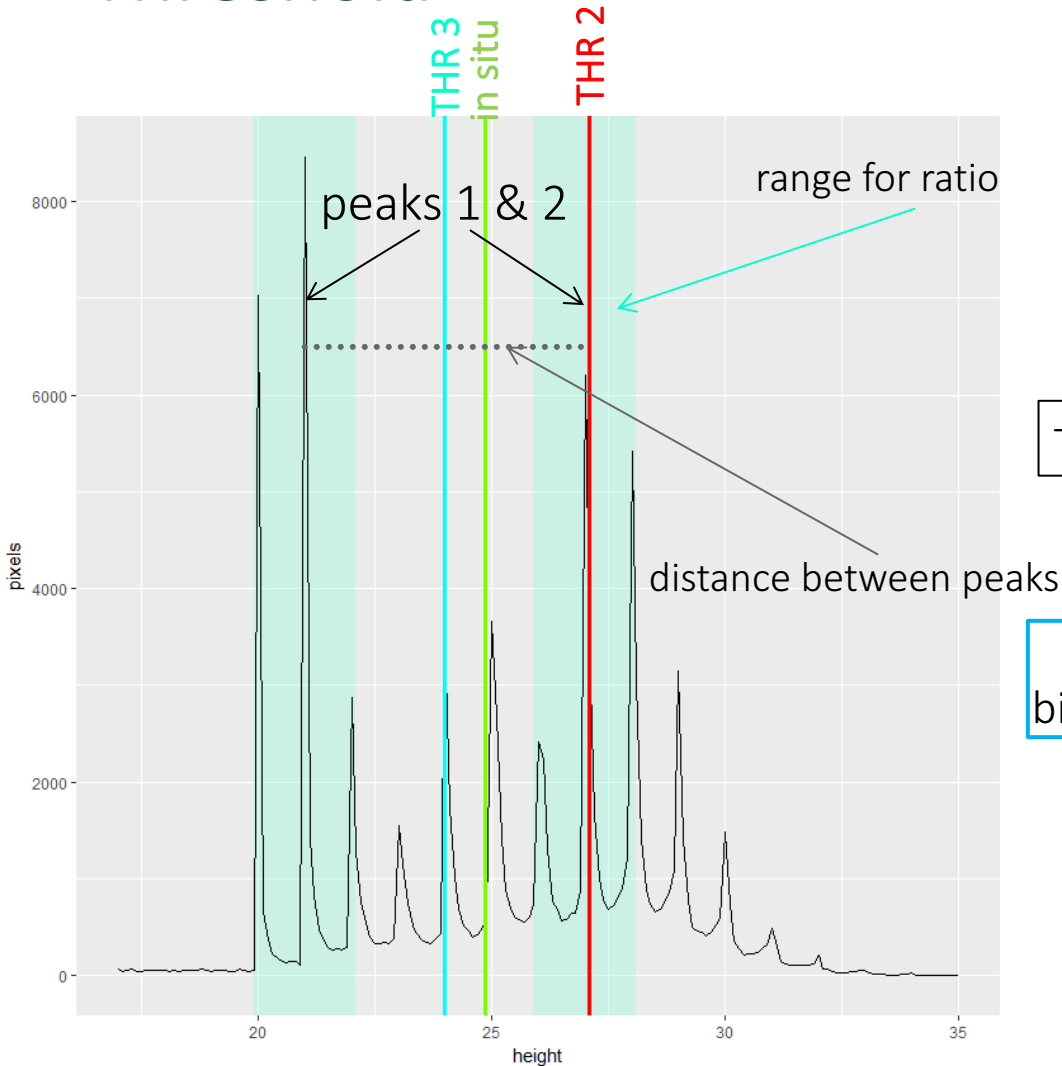
advancement of THR 2

Difficulty to handle bi-modal  
distributions

⇒ Actually two thr's needed  
Compromise for lower level

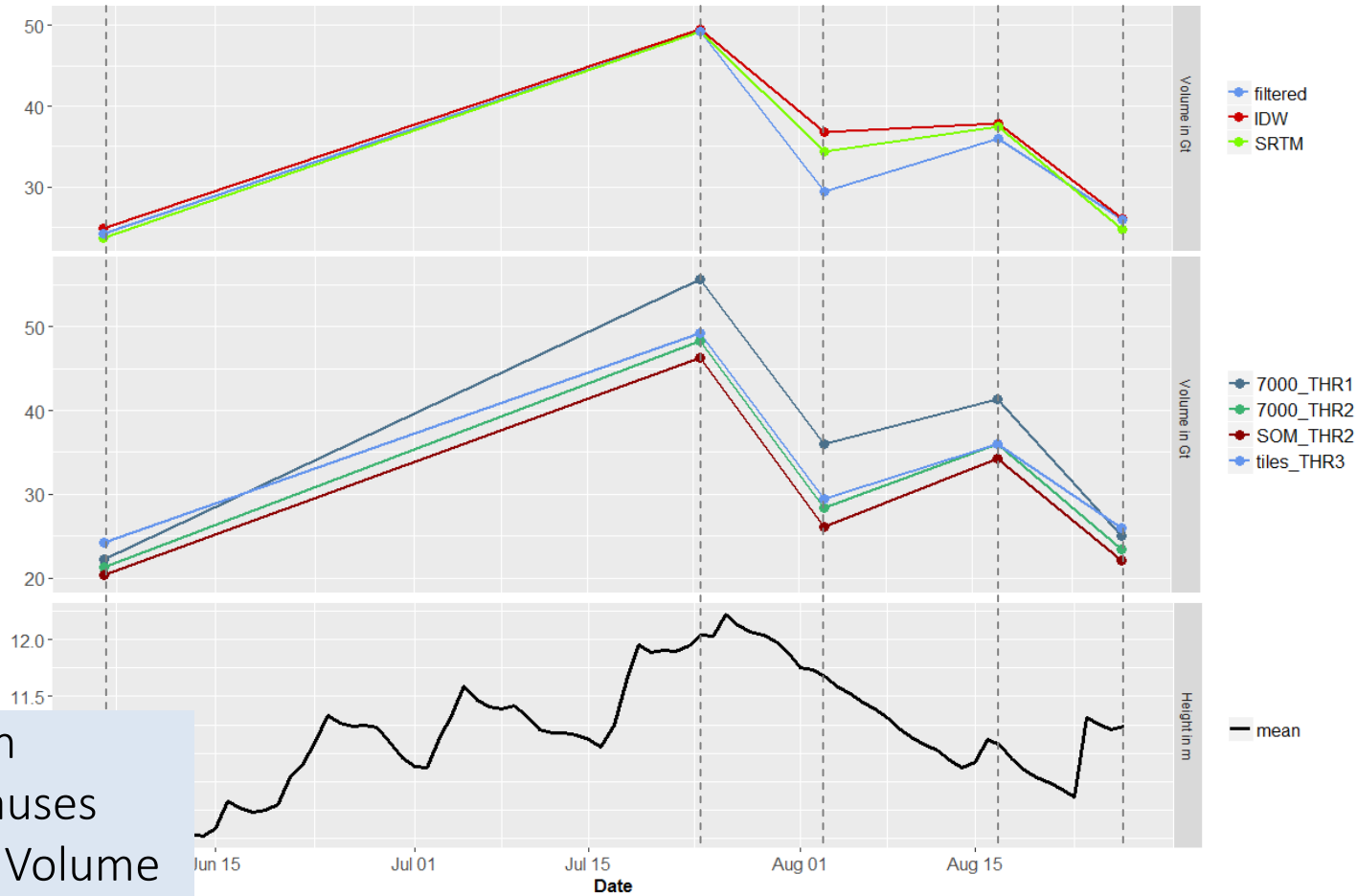


# Threshold



# Results

Calculated volumes compared to the mean of water level gauge measurements

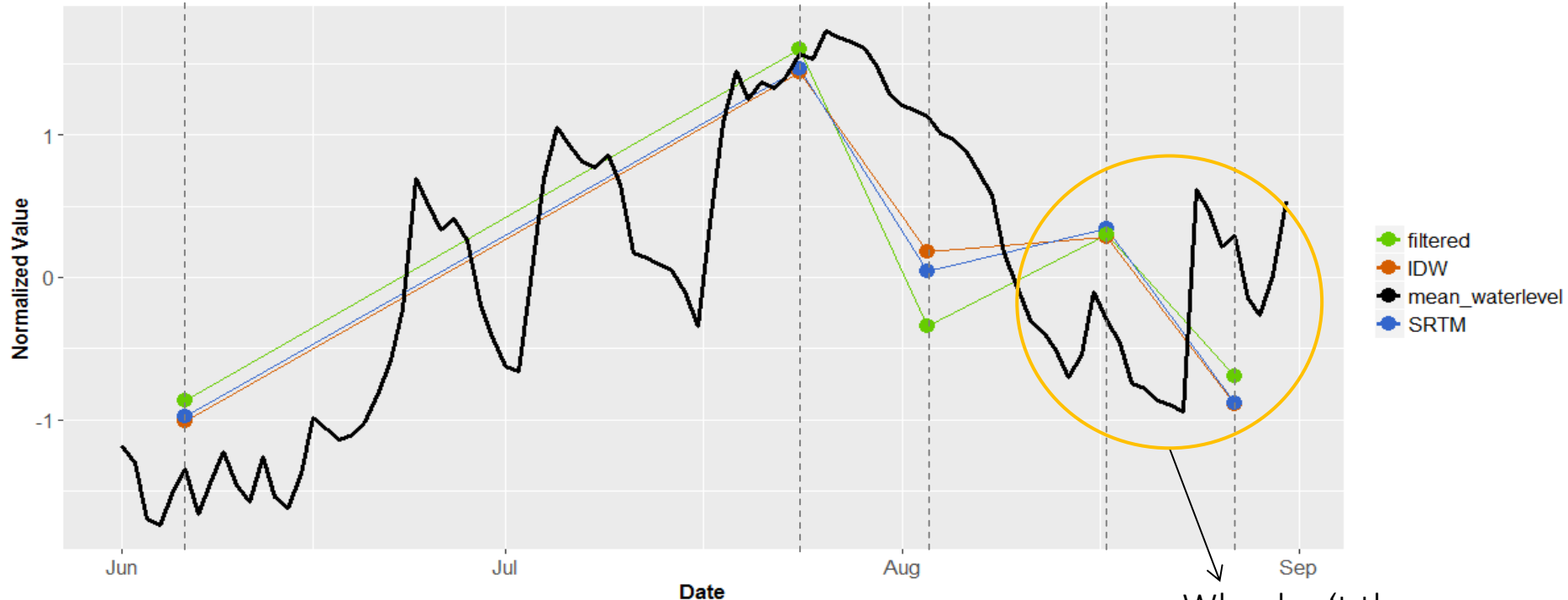


=> Impact of chosen threshold and grid causes higher differences in Volume than the impact of the DEM

# Discussion

## Normalized volumes & mean water levels

For comparison, the mean value of seven water level gauges in Bangladesh is displayed.



Why don't they match with the gauge measurement?

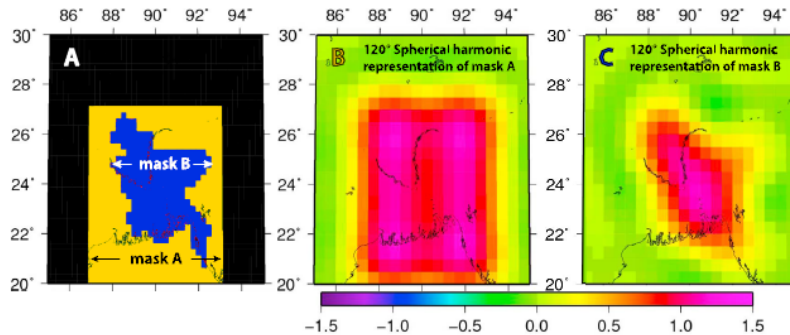
# Uncertainties

- Inaccurately orthorectified imagery
- Errors in the DEM (*absolute vertical accuracy is better than 9 m*)
- Errors in the gauge measurements
- Inaccuracy of the altimeter measurements (especially over rivers)
- Comparison from point to area values
- Wrong threshold/ grid size
- Inaccuracy in the correction for the same geoid/ellipsoid, ground lowering/deformation( STECKER et al. 2010)
- Zero of mean sea level of the gauge in Calcutta
- Inaccuracy of in situ water level measurements (but rather cm than meters)
- Time shift in gauge measurement and aquisition of SAR scene
- Change in elevation of river bed -> braided river!
- .....

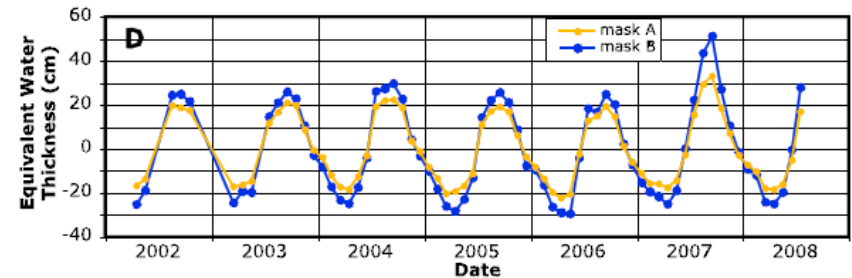


# Reference Study

## Mask used for volume estimations with GRACE



## Relative change in water thickness



## Comparing results :

STECKER et al. (2010:10):

*„Both sets of data indicate that in an average year just over **100 GT** of water is stored within Bangladesh. The Storage can reach **150 GT** during exceptional floods...“*

⇒ Up to 50 Gt are stored due to flooding

⇒ Results show 45 to 55 Gt of flood volumes depending on DEM and THR

⇒ still accuracy in range of Gt is not accurate enough!

# Conclusions

- So far, it is possible to calculate inundation depth to an **accuracy of  $\approx 2$  m** compared to water level measurements
- The volume estimations fit to the results of other values in literature in a range of Gt
  - the **kind and size of a grid** has highly influences the results => a dynamic fishnet grid derived best results
  - **THR 3 delivered best results** as it can handle bi-modal distributions
  - Different DEMs deliver different results, full magnitude will be defined by TanDEM-X data
- The volume estimation is automated, as the script is fully automatic