

University of Colorado Boulder



# **Remote Sensing**

Applying satellite data to support analyzing fluvial processes

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# Layout

Brief intro to remote sensing

Fluvial Geomorpholgy related Remote sensing

Monitoring discharge

Monitoring surface water extend

Analyzing flood frequency

Remote sensing

**Remote sensing** is the art, science, and technology of *observing* an object, scene, or phenomenon by *instrument-based* techniques.

Where **remote** means that the observation by the instrument is done **at a distance**, without physical contact.

For example using: satellites – airplane – drone – balloons – etc.

### Advantages and disadvantages of Remote Sensing

#### Advantages

- Provides data over large areas
- Provides data of very remote and inaccessible regions
- Able to obtain imagery of any area over a continuous period of time through which the any anthropogenic or natural changes in the landscape can be analyzed
- Relatively inexpensive when compared to employing a team of surveyors
- Easy and rapid collection of data
- Rapid production of maps for interpretation

#### Disadvantages

- The interpretation of imagery requires a certain skill level
- Needs cross verification with ground (field) survey data
- Data from multiple sources may create confusion
- Objects can be misclassified or confused
- Distortions may occur in an image due to the relative motion of sensor and source

## Different types of Remote sensing



Satellites that contain **passive** sensors include:

- LandSat
- MODIS (Aqua/Terra)
- VIIRS
- Sentinel 2

Satellites that contain **active** sensors (e.g. Radar/Lidar):

- Sentinel 1 (a/b)
- ICESat-2
- TRIMM \*
- GPM \*
- SWOT (Surface water Ocean topo)\*

\*) only certain sensors Data from Passive RS is often more intuitive (less complicated) to analyze.

# Different temporal – Spatial – Spectral resolutions

- **Temporal resolution**: the return period (time between images) of taking an observation at the same location
- Spatial resolution: the size of the smallest feature that can be detected by a satellite sensor
- **Spectral resolution**: the ability of a satellite sensor to measure specific wavelengths of the electromagnetic spectrum

Sensor	Temporal resolution	Spatial resolution	Launch year
MODIS	2 x Daily	250m	Early 2000s
VIIRS	1 x Daily	325m	2011
LandSat	16-day repeat	30m	1 <sup>st</sup> generation 1984
Sentinel	5-10 day repeat	10 (20-60)m	2015

# Fluvial Geomorphology related Remote sensing Map simple river characteristics from optical imagery

Using imagery for 1 time period, utilizing the R,G,B bands):

- River width, length
- Slope (underlying DEM)



#### **Inundation** Extents

- Normalized Difference Water Index (regular, modified, and weighted) with Landsat Imagery over time
- Using Landsat 8 C2, T1 TOA imagery between 2014-2023, NDWI over time and water pixel area over time specifically for Ciénaga El Opón

More advanced methods to measure e.g. inundation extents over time



#### **Presentation by Serena Butler**

• Utilizing different wavelength bands (spectral resolution, beyond R,G,B) to measure water extent (Normalized Difference Water Index (NDWI)).

• NDWI uses Near-Infrared & short-wave infrared channels

# Many indices are available

Different indices for different sensors on specific satellites

New indices are still developed / optimized

https://www.indexdatabase.de

https://www.nv5geospatialsoftware.com/docs/AlphabeticalListSpectralIndices.html

#### Alphabetical List of Spectral Indices

- Alunite Index (ALUI)
- Anthocyanin Reflectance Index 1 (ARI1)
- Anthocyanin Reflectance Index 2 (ARI2)
- Atmospherically Resistant Vegetation Index (ARVI)
- Burn Area Index (BAI)
- Calcite Index (CALI)
- Carbonate Index (CARI)
- Cellulose Absorption Index (CAI)
- Clay Alteration Index (CLAI)
- Clay Minerals Ratio (Clay)
- Carotenoid Reflectance Index 1 (CRI1)
- Carotenoid Reflectance Index 2 (CRI2)
- Difference Vegetation Index (DVI)
- Disease Water Stress Index (DWSI)
- Dolomite Index (DOLI)
- Enhanced Vegetation Index (EVI)
- Epidote / Chlorite / Amphibole Index (ECAI)
- Ferric Iron Alteration Index (FEAI)
- Ferrous Iron (Fe2+) Index (FEI)
- Ferrous Minerals Ratio (Ferrous)
- Ferrous Silicates Index (FESI)
- Global Environmental Monitoring Index (GEMI)
- Green Atmospherically Resistant Index (GARI)
- Green Chlorophyll Index (GCI)
- Green Difference Vegetation Index (GDVI)
- Green Normalized Difference Vegetation Index (GNDVI)
- Green Optimized Soil Adjusted Vegetation Index (GOSAVI)
- Green Ratio Vegetation Index (GRVI)
- Green Soil Adjusted Vegetation Index (GSAVI)
- Green Vegetation Index (GVI)
- Hydroxyl-Bearing (OH) Altered Minerals Index 1 (OHI1)
- Hydroxyl-Bearing (OH) Altered Minerals Index 2 (OHI2)
- Hydroxyl-Bearing (OH) Altered Minerals Index 3 (OHI3)
- Infrared Percentage Vegetation Index (IPVI)
- Iron Oxide Ratio (Iron Oxide)
- Kaolinite Index 1 (KAI1)
- Kaolinite Index 2 (KAI2)
- Kaolinite Index 3 (KAI3)
- Laterite Index (LATI)
- Leaf Area Index (LAI)
- I eaf Chloronhvll Index (LCI)

### Eye-candy Evolution of Ucayali River, Peru – 1985 - 2011



Multiple images, long term period

Pacific Ocean Atlantic Ocean

- Changes in water extent
- Changes in sinuosity
- Formation of oxbow lakes
- Connectivity of lakes / wetlands / etc

# Fluvial geomorphology case study

Detect storage and remobilization of sediments by analyzing morphological impact at regional scale of a large flood event

#### Indus River: a regulated fluvial system

- Heavily engineered system -> levees along most of the main river channel (>1,500km long)
- Largest irrigation network in the world
- Discharge reduced from ~3,000 to ~300-800 m<sup>3</sup>/s (Average Magdalena River ~7,150 m<sup>3</sup>/s)
- Sediment flux to coast reduced to < 10%</li>

#### 2010 Flood specifics

- Flood lasted >2months (August-October 2010)
- 20 million people displaced, 2,000 fatalities
- Peak discharge ~32,000 m<sup>3</sup>/s (Sukkur Barrage); similar to 1976, 1986, 1988
- Large avulsion -> inundated ~40,000 km<sup>2</sup>



#### MODIS Terra - Aqua

- Day 210 (Jul 29<sup>th</sup>): Heavy rain in the upland
- Flood wave travels through the main channel in 10 days, then into the delta in 10 days.
- Flood wave travels through breach and low-lying floodplains in 42 days.









#### Remote sensing data analyzes techniques

Quantify:

- 1. Changes in the main channel
- 2. Spatially sediment deposits
- Determined *outline inundated area* based on water reflectance (*MODIS 7-2-1 band*)
- Established before & after flood centerlines of the main channel (LandSat, band 1)
- Set a conservative sediment reflectance value (Rv) (LandSat, band 1) by validating (ASTER-A1 & Maxar imagery) for whole region
- Defined the *inner and outer* stretch of each bend for whole river (>1500km)







21 22

Δ q Upstream **River outlet Distance (per 50km segments)** 





#### Crevasse splays









#### Findings 1: Longitudinal sediment deposition



#### Findings 2: Lateral sediment deposition



- 47 km<sup>2</sup> of bedload was deposited
- Most sediment is deposited within 1km of the channel (82%)
- Only 43% of sediment is deposited in inner bends

#### Findings 3: Correlations with channel activity





# Utilizing remote sensing Monitoring water discharge

# Monitoring water discharge from space, why?

I mean, there are gauging stations!





### Ground based observations Water discharge

Gauging stations are expensive to build and maintain. And if a gauging station is there, data gets hardly shared with other countries, although rivers cross boundaries.



#### Availability of historical discharge data in the GRDC database



#### Loss of gauging station with data record > 30 years

Additional advantages and disadvantages of Remote Sensing water gauging stations

#### Additional advantages

- Continuous record also in the event of a flood; unlikely gauging station which could get destroyed during a large event
- Back processing of data once preferable gauging location is set
- Crossing borders, can be applied globally

#### Additional disadvantages

- Lower temporal resolution (daily not every 5 10 minutes)
- Preferable gauging locations are not always an option (steep canyons, vegetation cover)

The Advanced Microwave Scanning Radiometer - Earth Observing System (AMSR-E) is a twelve-channel, six-frequency, passivemicrowave radiometer. It measures horizontally and vertically polarized brightness temperatures, including at 36.5 GHz.

AMSR-E was developed by the Japan Aerospace Exploration Agency (JAXA) and launched by the U.S. aboard Aqua in mid-2002. It ceased operations in late 2011

Before AMSR-E, there was the TRMM satellite, which had a groundsensing 37 GHz channel. 1998 to 2015.

In 2012, AMSR-2 became operational, and has a brightness temperature at 36.5 GHz available (same as the GPM satellite, 2015 and ongoing





Several passive microwave satellites provide near complete daily coverage and their data can be used to measure river discharge changes. Availability of these data very likely to extend permanently into the future. Little interference by cloud cover.

#### Ground based Gauging station

#### DEPTH



#### Satellite based Gauging station







Elizabeth Morales



### **River discharge**

Q = Width x Depth x Velocity





When rivers rise (discharge, Q, m<sup>3</sup>/sec, increases), flow width and water surface area also increase.

River Watch sites use satellite passive microwave radiometry to sensitively monitor this in-pixel surface temperature change.



#### AMSR-E/AMSR-2 River discharge Measurement Method

Measuring temperature change by passive microwave signal



Global Flood Detection System (GFDS)

#### **GFDS** satellite-born sensors

GFDS calculates water surface metrics from brightness temperatures recorded at 36.5 GHz, both ascending and descending swaths. Full time series of four sensors constitute the input data (Table 1).

Sensor	Name	Satellite	Characteristics	Comments
AMSR-E	Advanced Microwave Scanning Radiometer - EOS	NASA's Earth Observing System (EOS) Aqua Satellite	2002-2011 Polar orbit, full geographic coverage	AMSR-E antenna stopped spinning at 07:26GMT Oct 4, 2011
			36.5 GHz (V, H)	
TRMM- TMI	TRMM Microwave Imager	Tropical Rainfall Measuring Mission	1997-2015 37.0GHz (V,H) 40S to 40N	Operations stopped on 15/04/2015
AMSR2	Advanced Microwave Scanning Radiometer 2	GCOM-W	2013-ongoing Polar orbit, full geographic coverage 36.5 GHz (V, H)	Integrated under ERCC1/MIC7
GPM- GMI	GPM Microwave Imager	Global Precipitation Mission	2015-ongoing 37 GHz (V, H)	Integrated under ERCC2/MIC8

#### Table 1. GFDS sensors and characteristics

65S to 65N



Figure 3. Timeline of GFDS data sources.

European Commission's "Global Flood Detection System" (GFDS) currently processes GPM and AMSR2 37 GHz data as soon as they are available at the JRC. Latency times vary: from around 3 hours (AMSR2) to around 24 hours (GPM; could be improved in future). In gap between AMSR-E and AMSR2, TRMM provided coverage, but not including latitudes above 40 deg N and S (*no coverage* over these large areas, late 2011-early 2013; the entire system would have been defunct save for back-up provided by TRMM). The merged product is also more reliable: better signal/noise due to averaging of additional data over a site.

The position value *P* indicates the relative position of the calibration pixel *C* to the measurement pixel *M*. The calibration pixel *C* is chosen as the 95 percentile of the pixels in a grid of 9by 9 pixels centered on the measurement pixel *M*. (It is not the hottest pixel to exclude outliers due to measurement error.) The position numbers of calibration pixels are listed in the figure below.

1	2	3	4	5	6	7	8	9
10	11	12	13	14	15	16	17	18
19	20	21	22	23	24	25	26	27
28	29	30	31	32	33	34	35	36
37	38	39	40	41	42	43	44	45
46	47	48	49	50	51	52	53	54
55	56	57	58	59	60	61	62	63
64	65	66	67	68	69	70	71	72
73	74	75	76	77	78	79	80	81

Figure 4. Position numbers of calibration pixels around the measurement pixel (41).



#### Site 144 (Venezuela) (Area 137 on Orinoco in Venezuela)

See other areas in Venezuela, on the Orinoco



**Current** Data

The flood magnitude is a measure of the size of the flood. Since lower signals generally accounts for increased water coverage, extreme events, or major floods, should represent anomalies in the time series of a given site. The reference value for normal flow is calculated as the average signal for the site since June 2002. Flood magnitude is defined as the number of standard deviations (sd) from the mean (avg). <u>Read more...</u>







### Translate Temperature to Discharge

If possible use Ground gauge data otherwise model

**Model-based rating** is comparison of *WBM* modeled monthly mean, maximum, and minimum discharges, 2003-2007, to the satellite-observed, time-equivalent signal









Measurement Site 787. The river channel is only ~ 70 m in width, but a 10 km long floodplain is monitored. At this site, modeled discharge is strongly correlated with the remote sensing signal.

The accuracy estimate for the signal is "Good"



Cooperative work including EU's Joint Research Centre (GDACS, Dr. Tom De Groeve) and DFO has resulted in a *global* network of satellite river gauging sites, with records extending on daily basis from 1998 up to today. Online display (click on dots).







<sup>(</sup>for this day of the year)

m3/sec

# Takeaway message Monitoring water discharge

- One method to measure water discharge (not biased by using different measurement techniques)
- Long daily time series (1998, onwards)
- Not dependent on having to contact government departments to order data (not hampered by country boundaries)
- Being able to construct daily water discharges back to 1998

# Utilizing remote sensing Monitoring surface water extend

## Natural disasters

- Flooding is *the* most common natural hazard worldwide & often devastating
- Impacts 21 million people every year
- Affects global GDP by ~\$100 billion every year







- 54 million people impacted per year
- > \$400 billion

World Resources Institute

#### By 2050 for Europe

5 fold increase in economic loss: *a) climate change, b) increasing value of land, c) urban development.* 

European Environment Agency

# On a global scale: increase in major flood events (M>6)



#### Flood Severity Class (1-2)

- Class 1: large flood events: significant damage to structures or agriculture; fatalities; and/or 1-2 decades-long reported interval since the last similar event.
- Class 1.5: very large events: with a greater than 2 decades but less than 100 year estimated recurrence interval, and/or a local recurrence interval of at 1-2 decades and affecting a large geographic region (> 5000 sq. km).
- Class 2: Extreme events: with an estimated recurrence interval greater than 100 years and affecting a large geographic region (> 5000 sq. km).

#### Magnitude (M) - Flood Magnitude =LOG(Duration x Severity x Affected Area)

### **DFO - Flood Observatory: Archive**



Register #	Annual DFO # (discontinu	Glide # ied)	Country	Other	Nations	Affected	Detailed Locations (click on active links to access inundation extents)	Validation (post event #3503)	Began	Ended	Duration in Days	Dead	Displaced	Damage (U
4410		0	Vietnam	0	#N/A	#N/A	Four central provinces	News	9-Oct-16	16-Oct-16	8	21	100000	
4409		0	Australia	0	#N/A	#N/A	South Australia, north of Adelaide	News	1-Oct-16	16-Oct-16	16	1	0	
		0	Romania	Albania	#N/A	#N/A	Eastern Romania, Albania	News	9-Oct-16	16-Oct-16	8	1	300	

# Establishing a flood archive

#### Many years of flood map data can help:

- better understanding geomorphological processes (changes in: channel activity, sinuosity, Pra-Pra-Pra)
- improving flood resilience, making people aware that they live in a flood prone area
- determine flood engineering solutions: cities / towns can build flood protection
- flood risk management: regulate (reduce) development in flood prone areas



Flood protection along the Rhine River, Germany

### Water extent detection methods

#### Automated: daily, global

- Water mapping using NASA's MODIS sensor on satellites Aqua and Terra
- Optical bands are used to classify water, applying a ratio (Band2 + A) / (Band1 + B) and a threshold on Band7

[band1 = visible; band 2 = Near infrared; band7 = short-wave infrared or SWIR]

 Collaboration with NASA Goddard Spaceflight Center to automate this to deliver Near-Real-Time water extents (from 2011 -> )

	090W 020N	080W 020N	070W 020N			
	090W 010N	080W 010N	070W 010N	060W 010N	14 1	
	090W 000S	080W 000S	070W 000S	060W 000S	050W 000S	040W 000S
- Aller		080W) 010S	070W 010S	060W 010S	050W 010S	040W 010S
ALL A	- AL	080W 020S	070W 020S	060W 020S	050W 020S	
		080W) 030S	070W) 030S	060W 030S		1. A. M.
		080W 040S	070W 040S			
		080W 050S	070W 050S			





	Terra	Aqua
Launch date	December 18, 1999	May 4, 2002
Mission duration	6 years (lasting over 23 years)	6 years (lasting over 21 years)
Dimensions	3.5m x 3.5m x 6.8m	4.8m x 8.0m x 16.7m
Orbit	Pole orbiting, 16 times a day, crossing equator at 10:30am	Pole orbiting, 16 times a day, crossing equator at 1:30pm (south to north)

### Terra



- Pole orbit
- Circles 16 times a day the earth
- Near global coverage

# Using MODIS satellite data

Advantage of MODIS satellite derived data

- a) Daily, near global coverage with 2 images
- b) High resolution (250m)
- c) Consistent use of methods globally
- d) Over 2 decades of imagery -> long history of flooding



Disadvantage (when using visual bands) a) .....

. . . . .

### Disadvantage



Cloud shadows



### To overcome cloud shadows



#### 3-day composite

pixel = water when detected 4 times



So day product = 3-day composite

# Disadvantage (II)

#### Northern Rocky mountains, North America 17 December 2018

#### Mountain shadows

- Mountains
- Low sun angle

Mountains at higher latitudes, during winter

## Using satellite data

Advantage of (some) satellite derived data:

- a) Daily, near global coverage
- b) Consistent use of methods globally

#### **Over 2 decades of water related products**

Disadvantage (when using visual bands):

- a) Obstruction of view due to clouds
- b) false positives due to cloud shadow
- c) Mountain shadows

# Daily water extent

#### **Red layer**

Water detected over last 3 days (at least 4 out of 6 images detect water for a grid cell).



Ani	nual accumulated	CHAKIA
wa <sup>-</sup>	ter extent	a
2017		M
2016		6.4.9
2015		
2014	Water detected per year (accumulated per	LAICAN
2013	year).	Contraction of the
2012		🚵   ¥
2011		HAJIPU
2010		PATNA
2009		KHAGAUL
2008		S
2007		100
2006		gna
2005		State utility
2004		Ekang
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### "Flood heat map"

Frequency of how often an area is flooded on an annual base over a 5 year period (2013 – 2017).



Santa Fe region, Argentina

### "Flood heat map"

Frequency of how often an area is flooded for a given year.





### Information some Satellites used

Satellite	Algorithm	Resolution / return interval	Reference	Active since
(Terra / Aqua) MODIS	$\label{eq:Dartmouth Flood} \begin{tabular}{lllllllllllllllllllllllllllllllllll$	<b>250 m</b> Daily 2 images	Brakenridge and Anderson, 2006, Otsu, 1979	~2000 - >
Landsat	<u>Automated Water</u> <u>Extraction Index</u> (AWEI) AWEI = BLUE +2.5xGREEN - 1.5x(NIR+SWIR <sub>1</sub> )- 0.25xSWIR <sub>2</sub>	<b>30 m</b> 16 days (8 days if combined with LS 7)	Feyisa et al., 2014	1984 -> (Different Landsat satellites)
Sentinel-1 (1a & b) Radar (SAR)!	DFO C-band Synthetic Aperture Radar	<b>10 m</b> 2-6 days location depended	Matgen et al., 2011	2014 ->
(Suomi NPP) VIIRS	DFO, more or less same as MODIS	<b>375 m</b> Daily 1 image	Brakenridge and Anderson, 2006	~2012 ->
Sentinel-2 (2a & b) (optical)	AWEI DFO	<b>10 m</b> 10 days (5 if combined 2a & b)	Feyisa et al., 2014 Brakenridge and Anderson, 2006	
Digital Globe satellites (WorldView 1, 2, 3 & 4) (GeoEye-1) (QuickBird)		~30 – 50 cm (Panchromatic) 1.7 (WV1) to daily (WV 3&4) but small areas		2007 (WV1) -> 2008 (GeoEye) -> 2010 (WV3) -> 2017 (WV4) -> 2001 (QB) - 2015

# Various Sensors and Satellites



250m, 2 daily , 2000present

30m, 16 days, 1984-present 10m, 2-6 days, 2014-present

Permanent Water

# Automated Sentinel 1a,b flood products



Satellite: Sentinel-1 is a space mission funded by the European Union. Executed by ESA within the Copernicus Program. Launched: April 2014; April 2016 Resolution: ~10m. Sensor: Synthetic-aperture radar

(SAR).

Revisit time of Sentinel 1a & 1b combined



✓ Two satellites in a 12 day orbit

✓ Repeat frequency: 6 days (important for coherence)

✓ Revisit frequency: (asc/desc & overlap): 3 days at the equator, <1 day at high latitudes (Europe ~ 2 days)

#### Advantage: 'looks through clouds'

# High resolution flood mapping

#### Hurricane Harvey



#### (08/28/2017)



- Category 4 hurricane at landfall
- 4-day period, many areas received ~1m of rain
- Displaced ~30,000 people, 107 fatalities, ~\$125 billion damage
- Flooding the greater Houston area

### Peru Floods: 20 March 2017



Estimate of flood extent based on SAR data from Sentinel-1A

# Utilizing remote sensing Analyzing flood frequency









RP = 2.0 year; Qmax = 5,395 m3/s RP = 15 year; Qmax = 14,800 m3/s RP = 20 year; Qmax = 17,530 m3/s

# Summary