



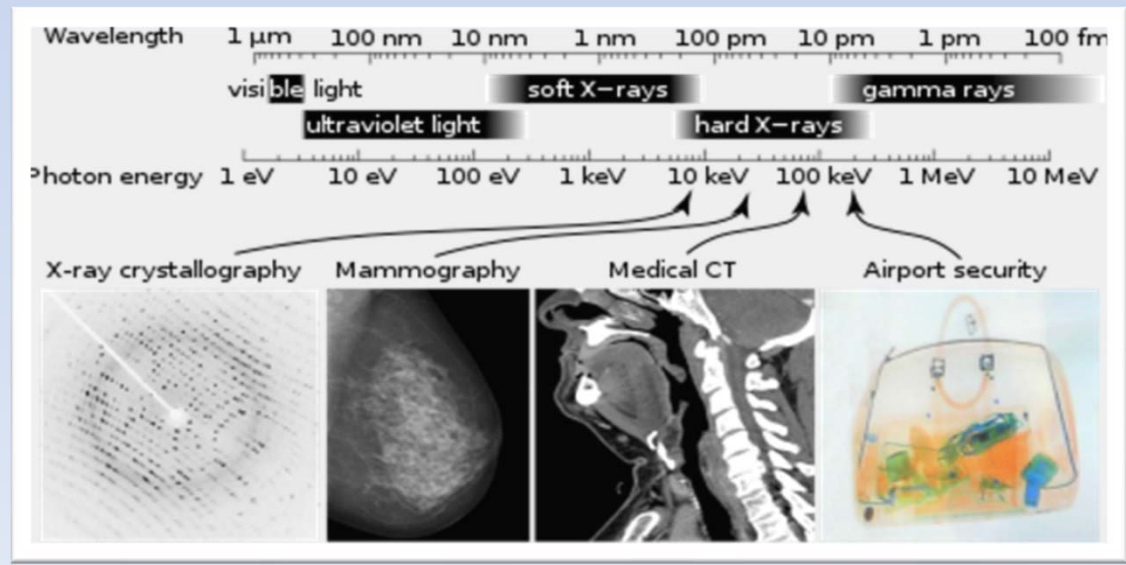
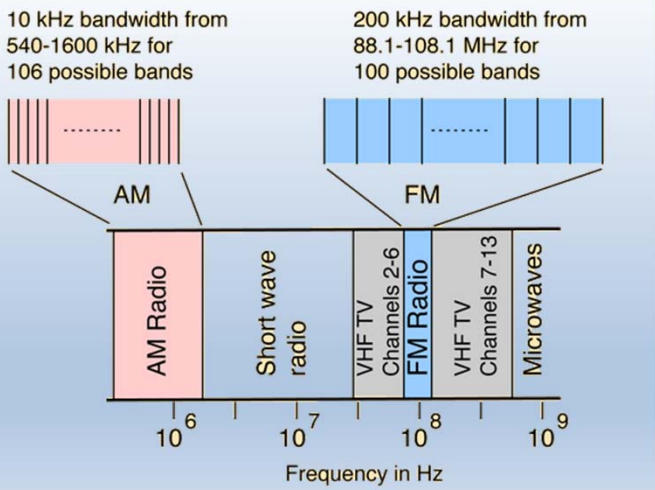
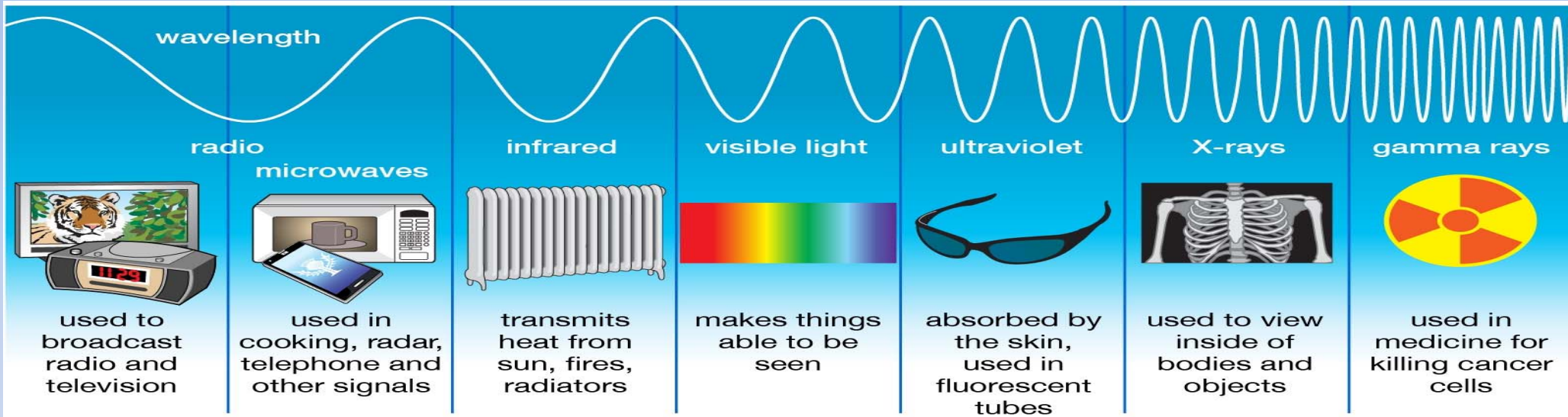
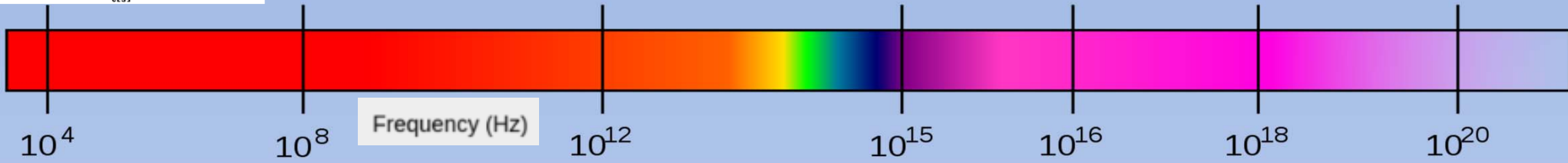
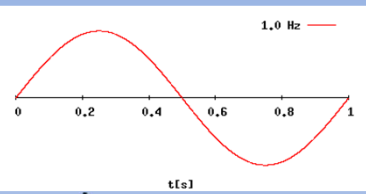
# Introduction to Satellite Remote Sensing

Dr. Tarendra Lakhankar

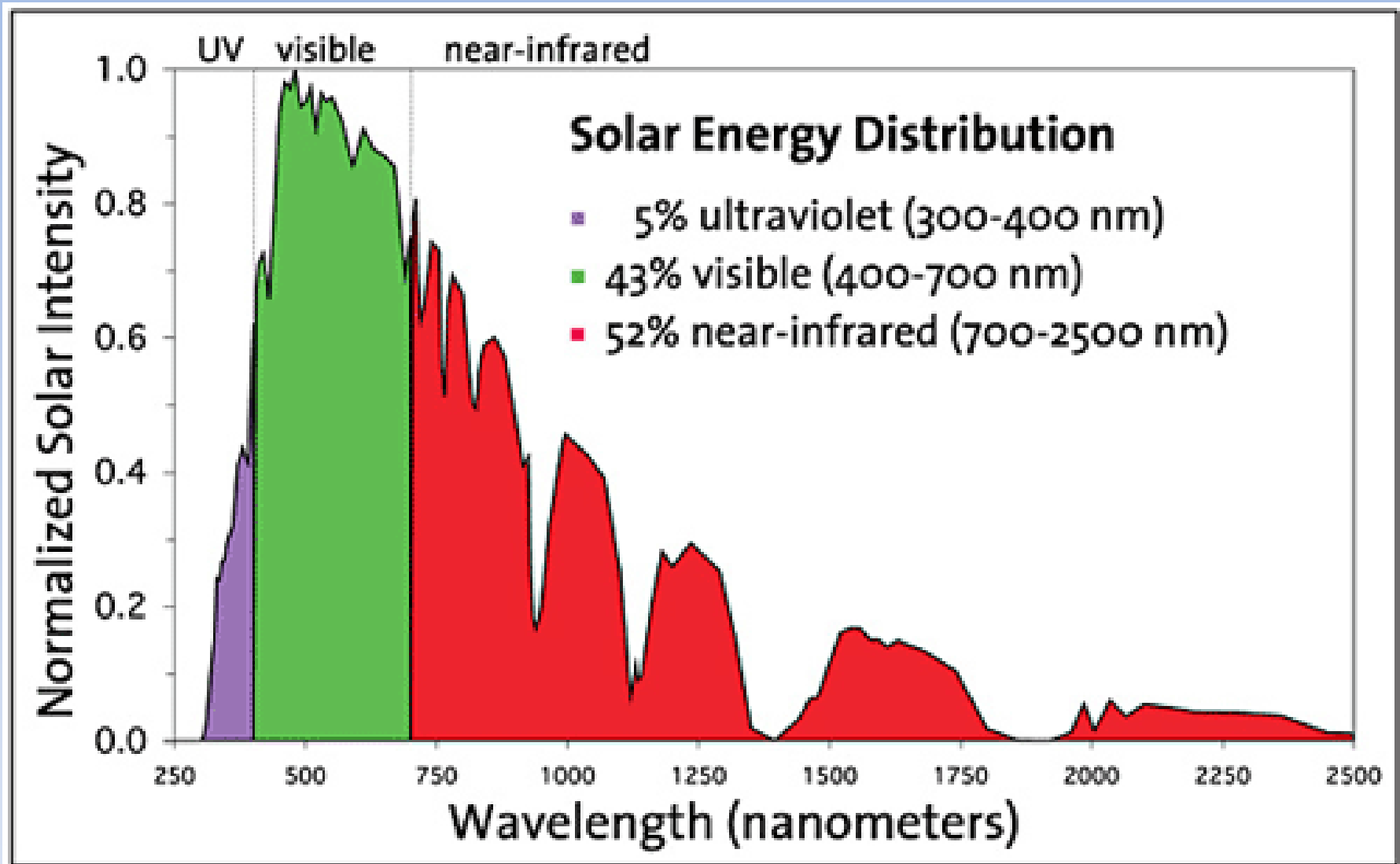
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# Range of Electromagnetic Spectrum



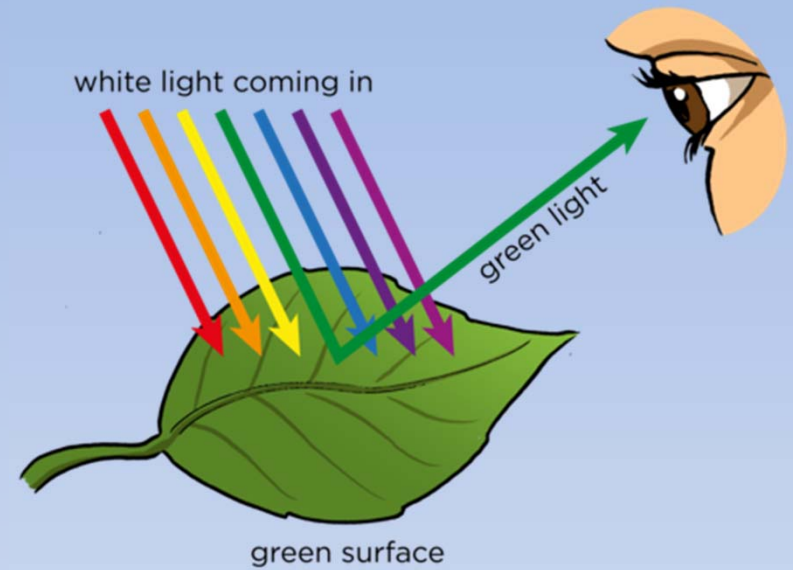
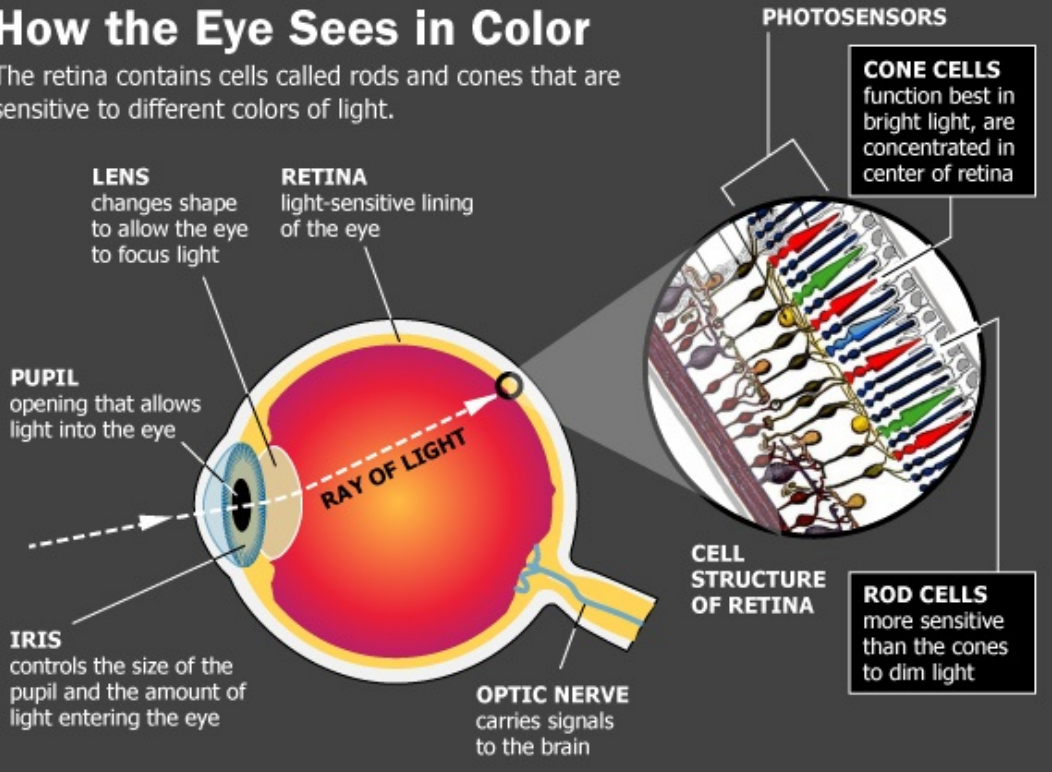
# Solar Energy Distribution



# Eye vs Camera

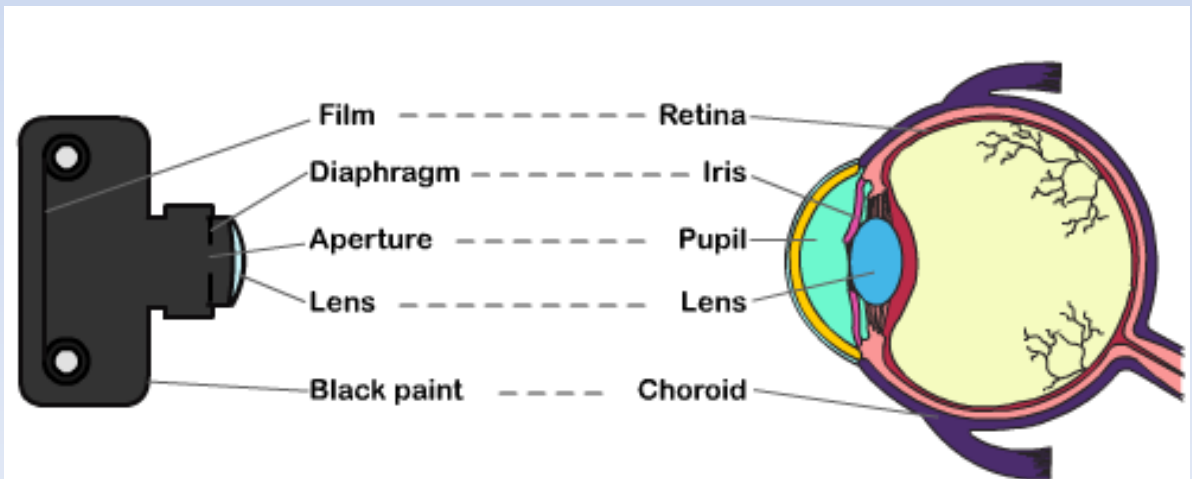
## How the Eye Sees in Color

The retina contains cells called rods and cones that are sensitive to different colors of light.



- Light energy is the only form of energy that we can see directly.

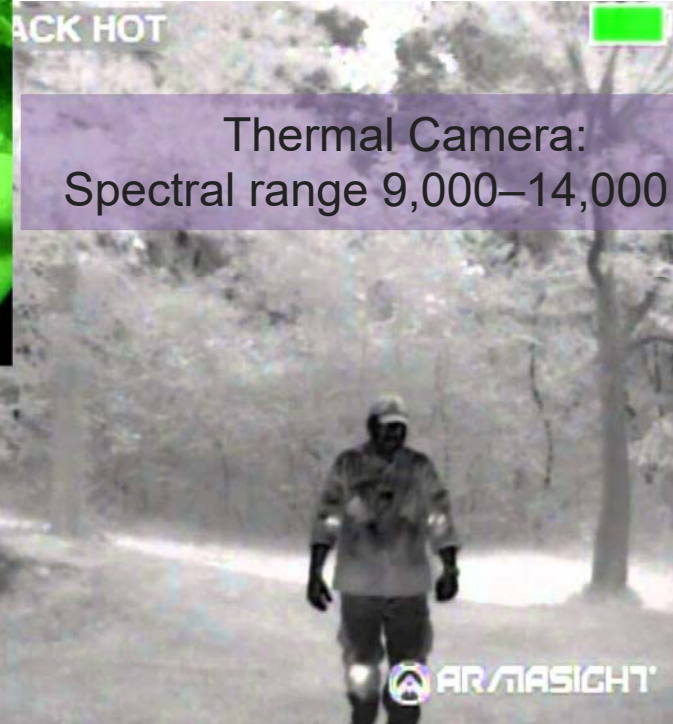
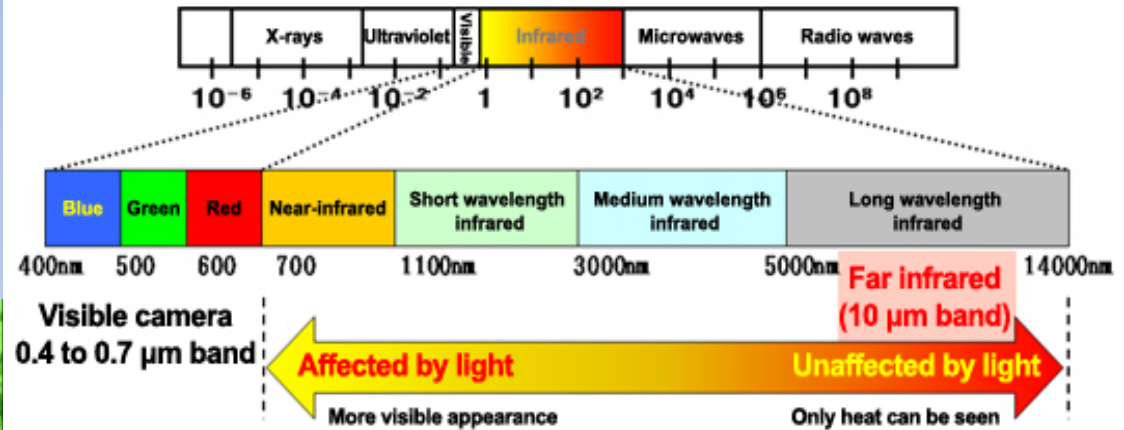
Color	Frequency	Wavelength
violet	668–789 THz	380–450 nm
blue	606–668 THz	450–495 nm
green	526–606 THz	495–570 nm
yellow	508–526 THz	570–590 nm
orange	484–508 THz	590–620 nm
red	400–484 THz	620–750 nm



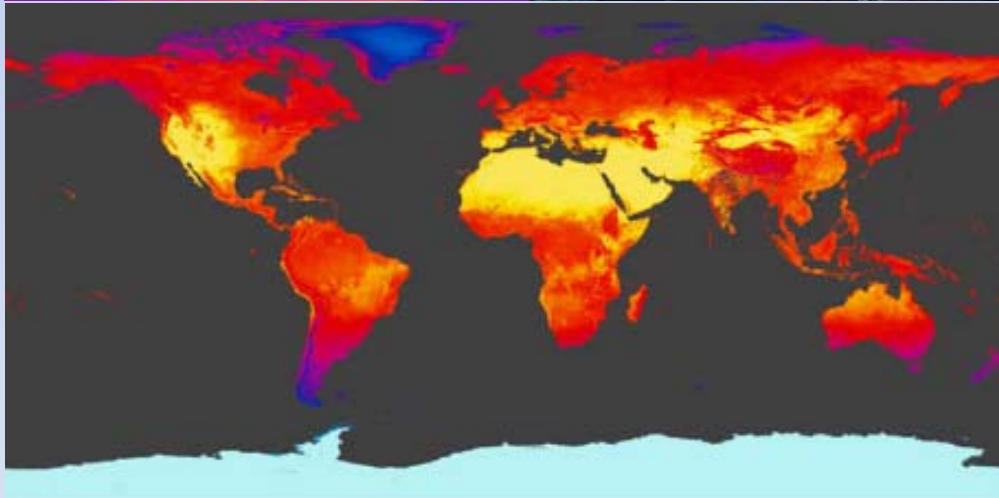
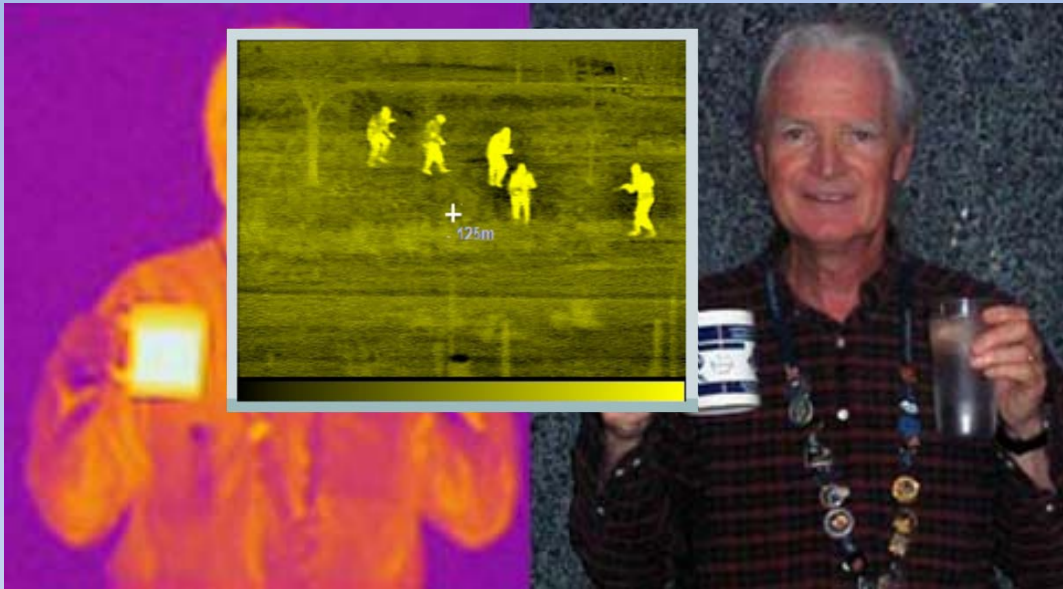


# Thermal vs night vision camera

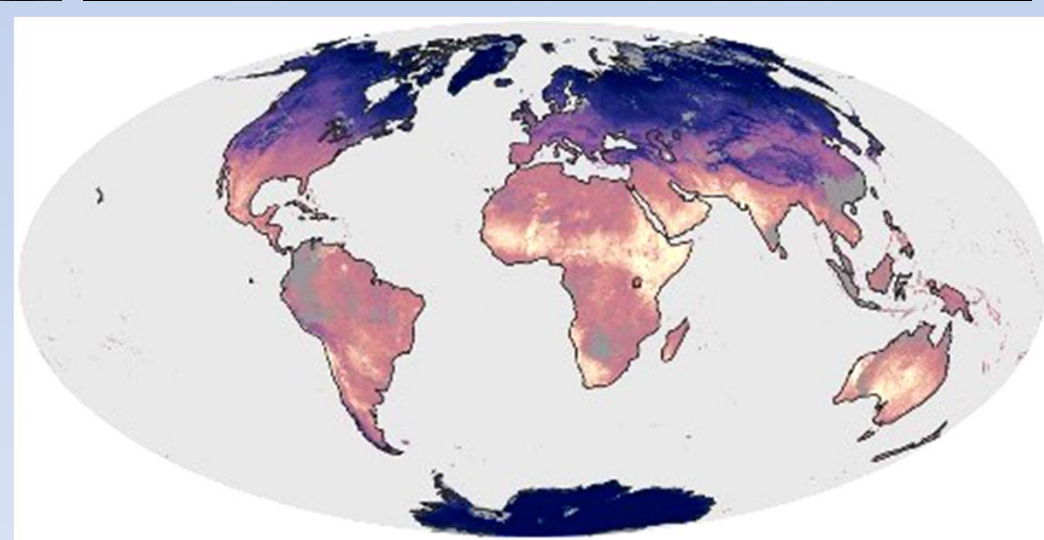
Generally, light known as infrared rays indicates electromagnetic waves on the optical wavelength with a longer wavelength of between 0.7  $\mu\text{m}$  and 1 mm.



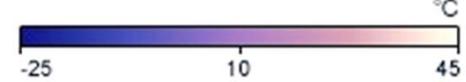
# Comparison of VIS and IR



Land Surface Temperature (deg C)



Land Surface Temperature (daytime)

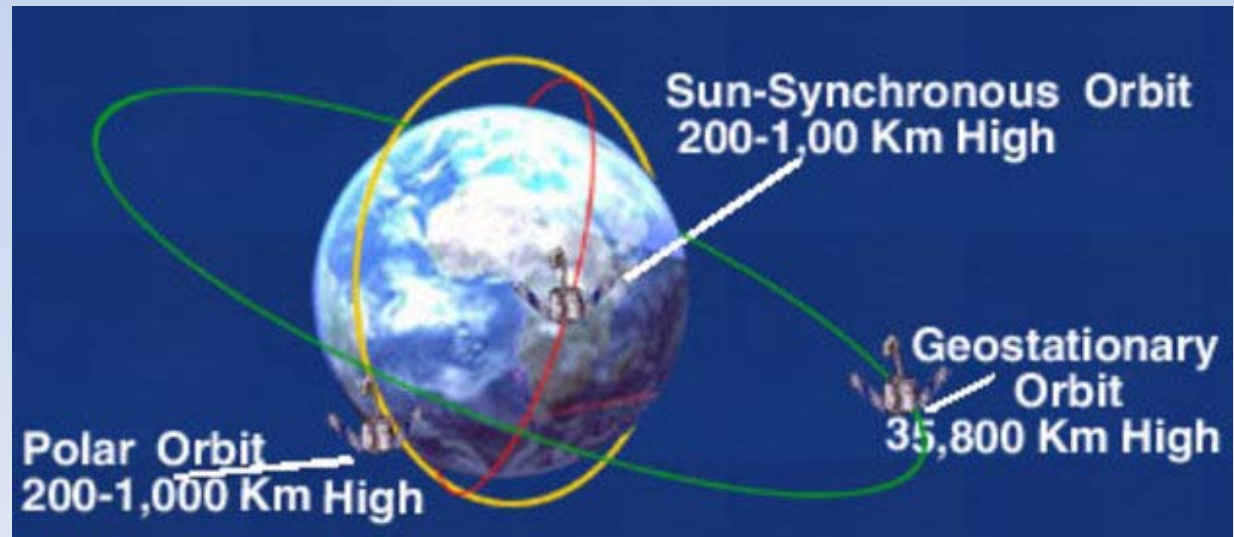
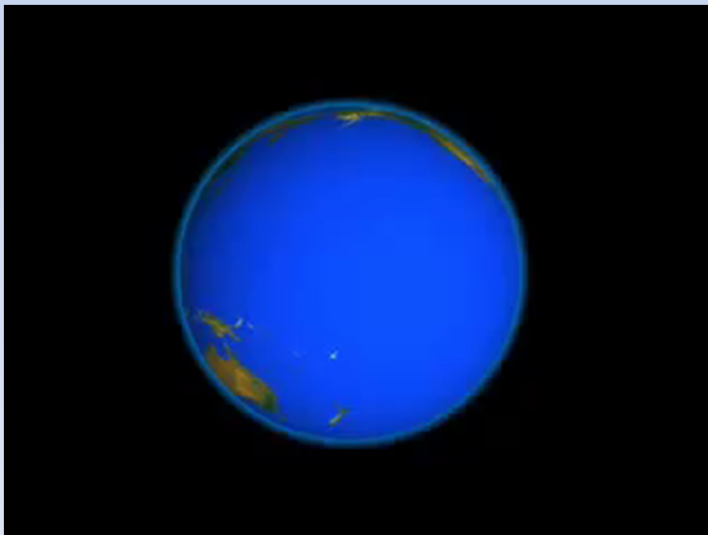
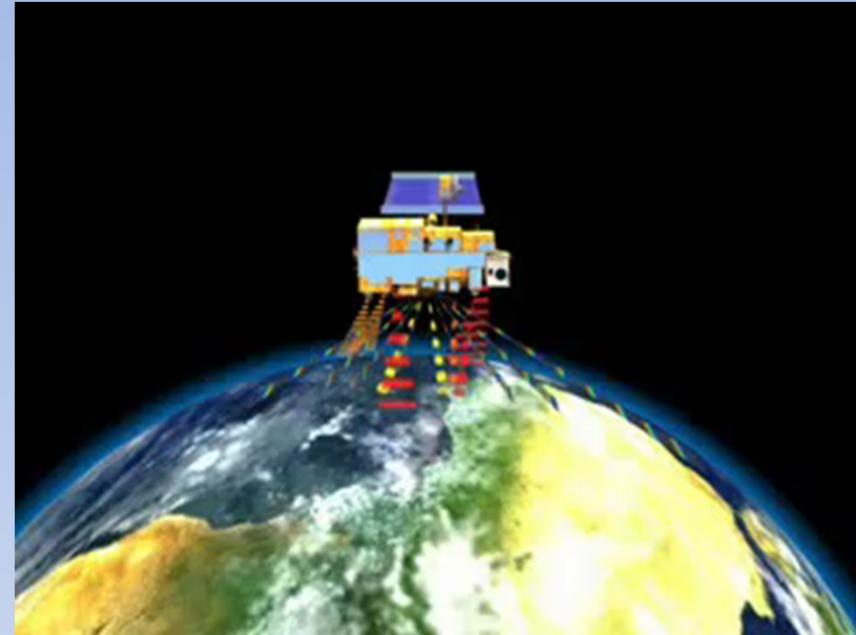


February 2000



# Remote Sensing

- Regular global and regional data with uniform quality
- Ability to combine satellite with other digital map layers (GIS) – cf. Google Earth
- Cost effective – many products are available.



# Weather and Climate Data

## Gaps in the weather map

The location of the world's key weather stations shows huge areas where information is not gathered



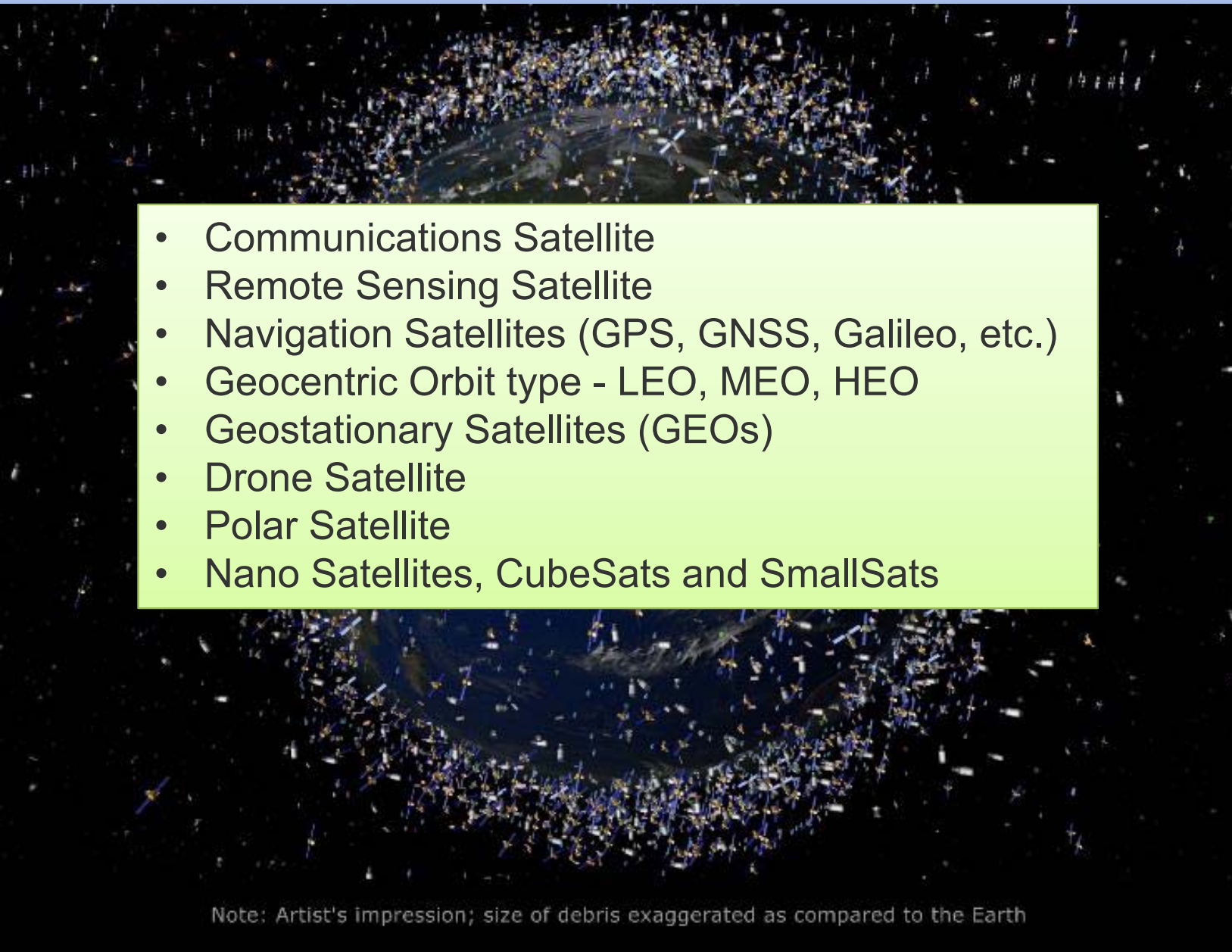
SOURCE: WORLD METEOROLOGICAL ORGANISATION

### Issues:

- Delay in processing the climate data (>1-3 years)
- Spatial and temporal gaps
- Limited measurements of variables (precipitation, temperature, wind speed, river runoff)

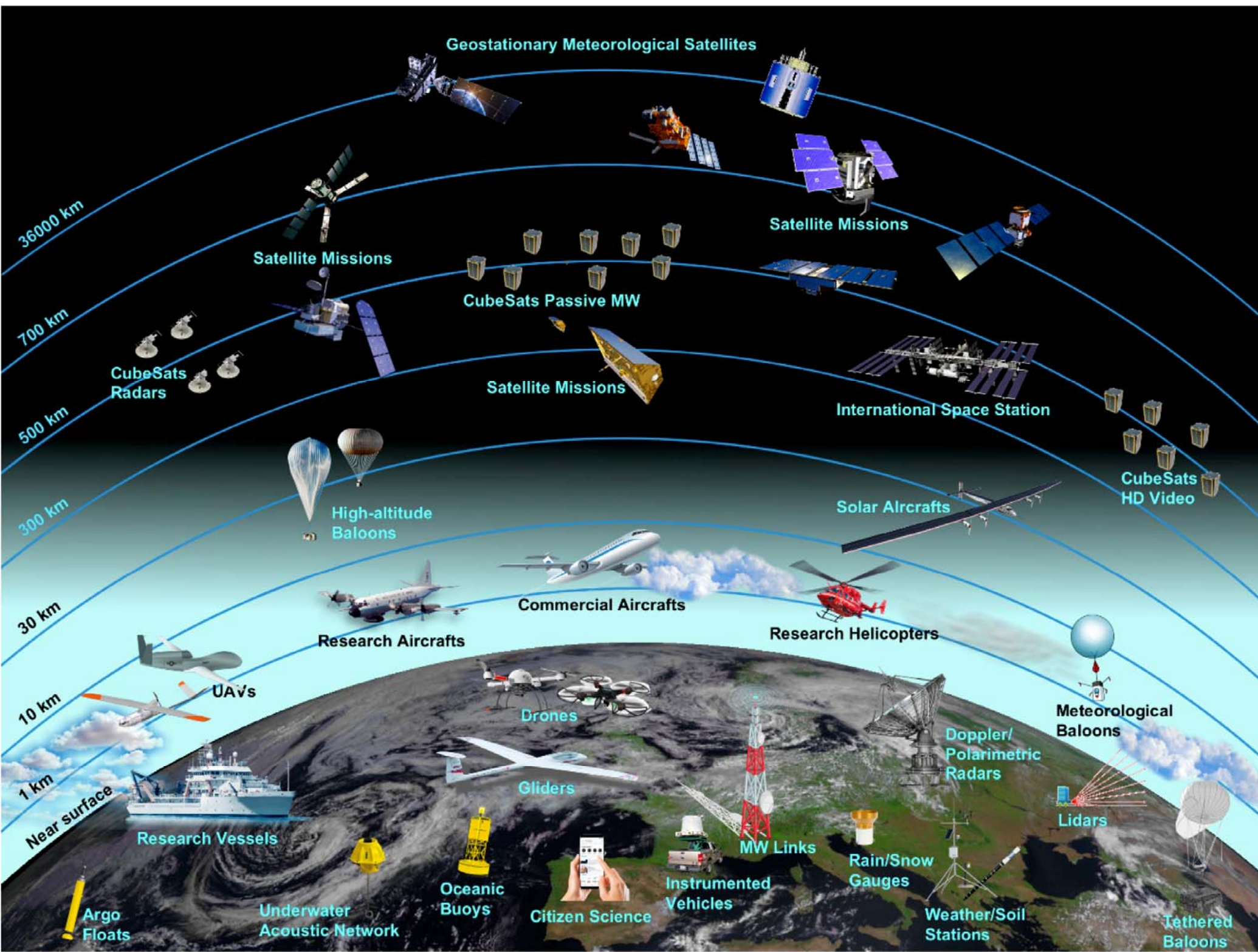


# How many satellites in Space?

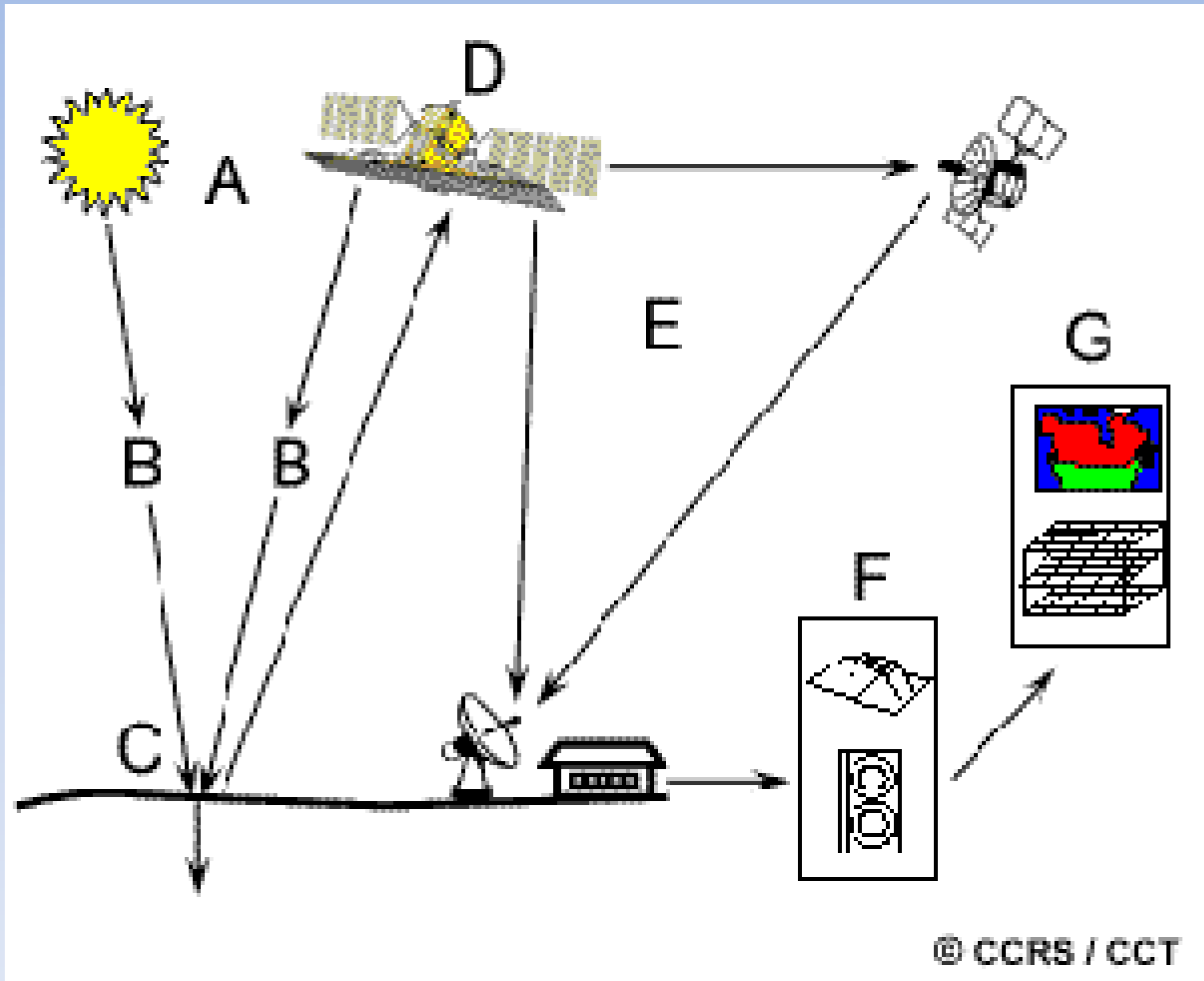
- 
- Communications Satellite
  - Remote Sensing Satellite
  - Navigation Satellites (GPS, GNSS, Galileo, etc.)
  - Geocentric Orbit type - LEO, MEO, HEO
  - Geostationary Satellites (GEOs)
  - Drone Satellite
  - Polar Satellite
  - Nano Satellites, CubeSats and SmallSats

Note: Artist's impression; size of debris exaggerated as compared to the Earth

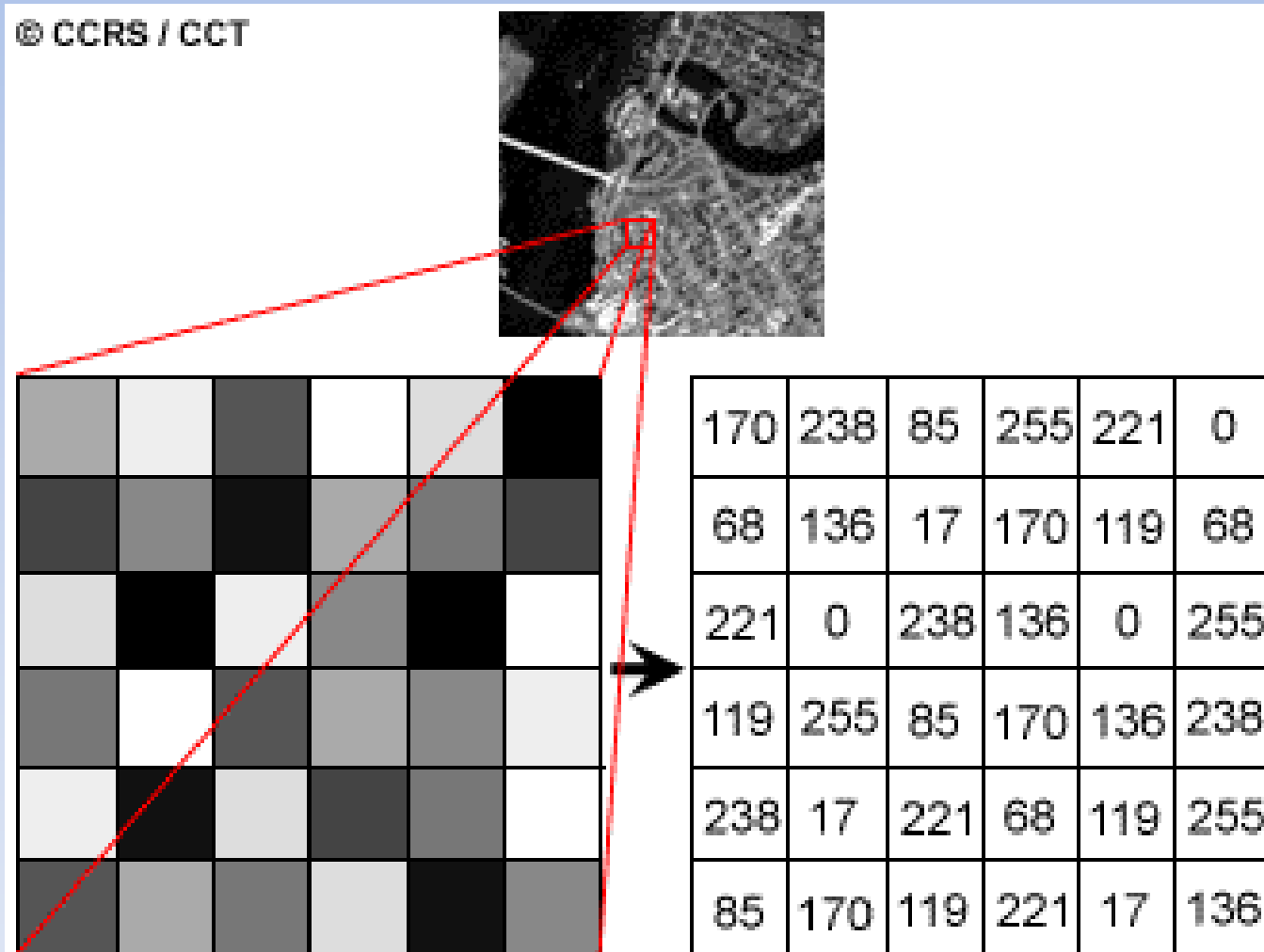
Currently there are approximately active 1,419 (4,256) artificial satellites orbiting the Earth.



# How we do Remote Sensing

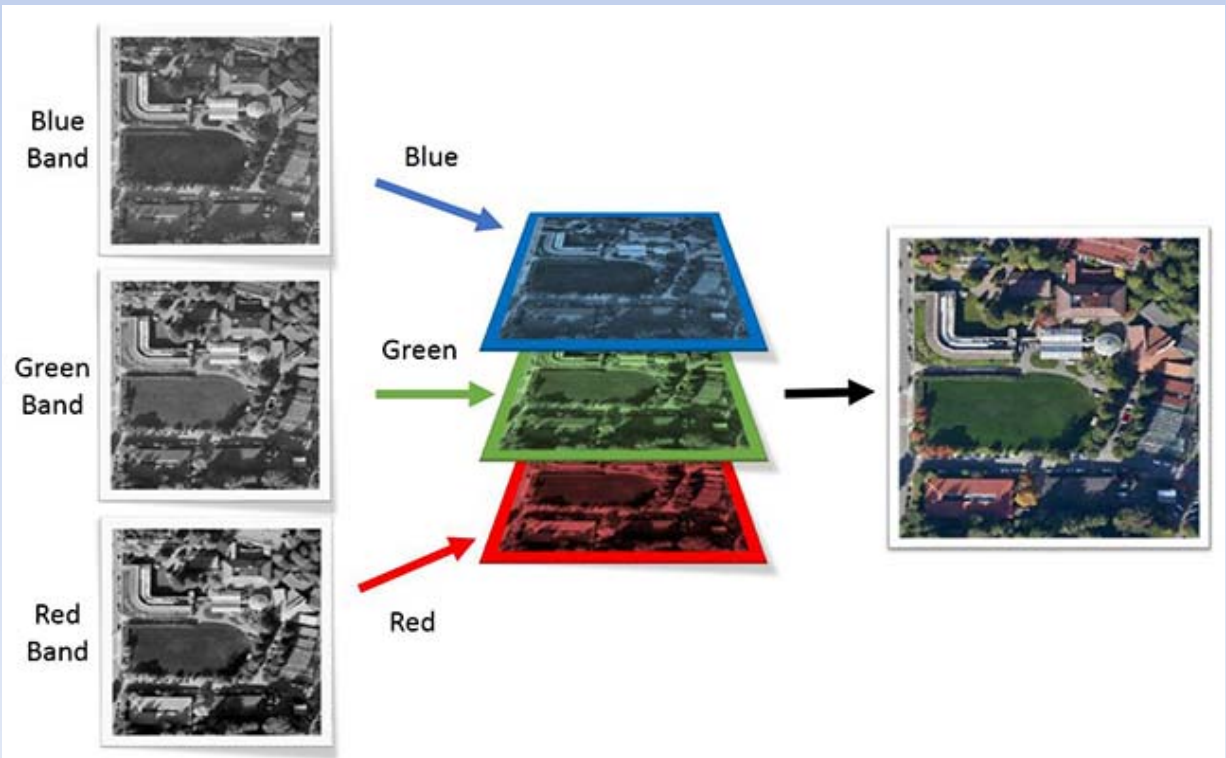
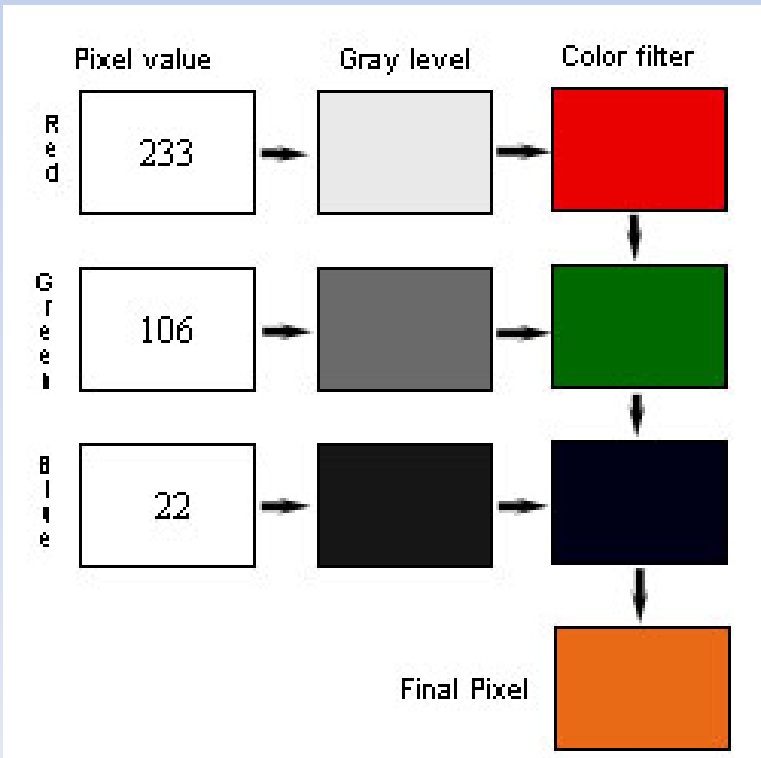
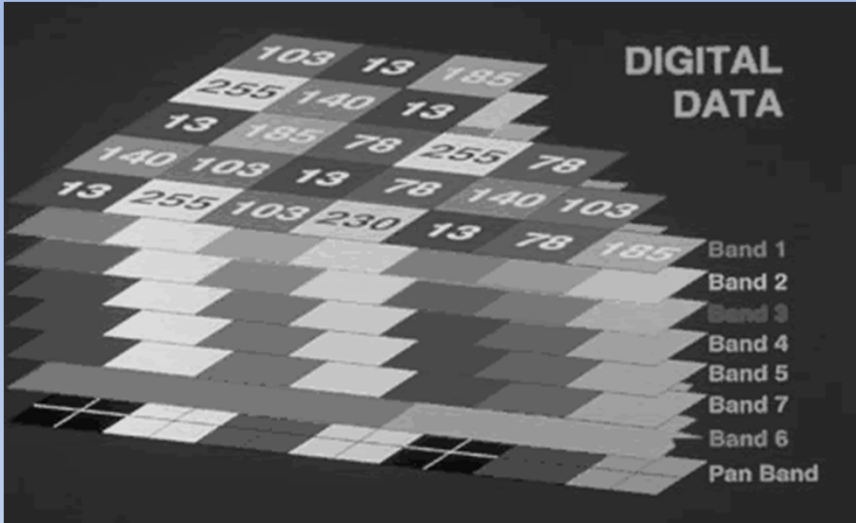
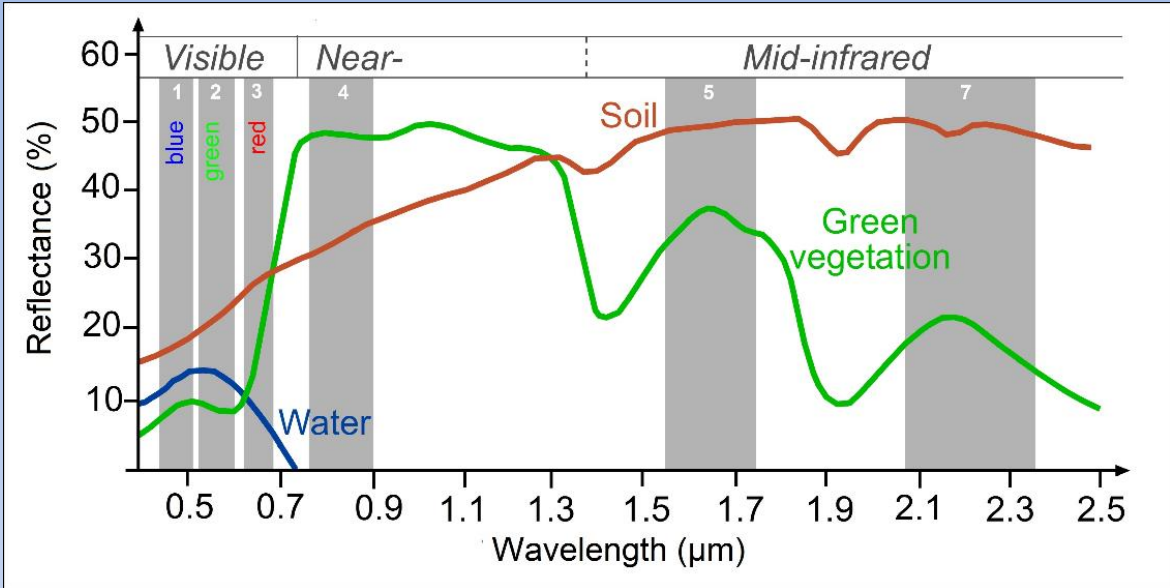


# Sensors record intensity of reflected energy numerically





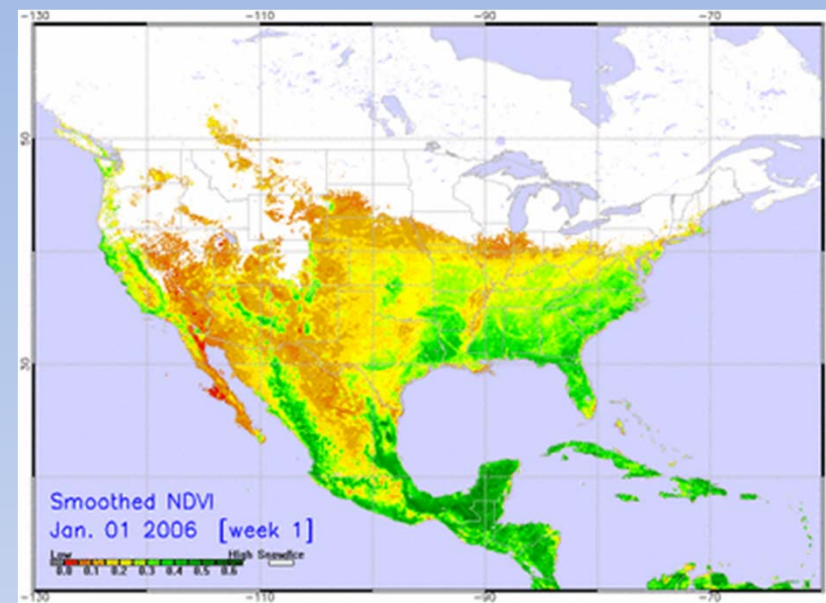
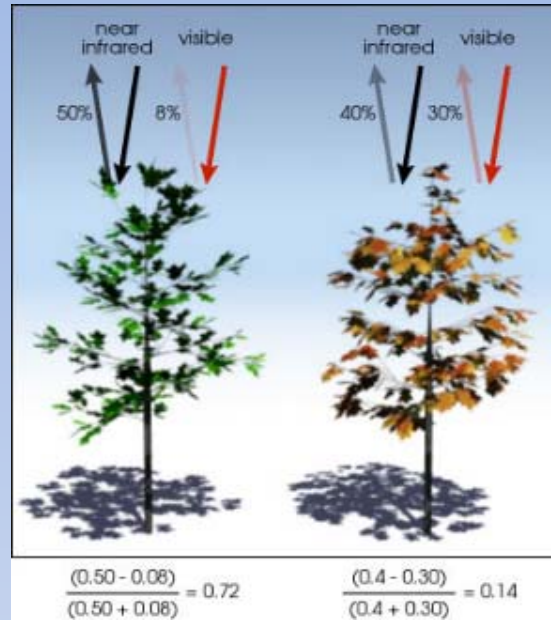
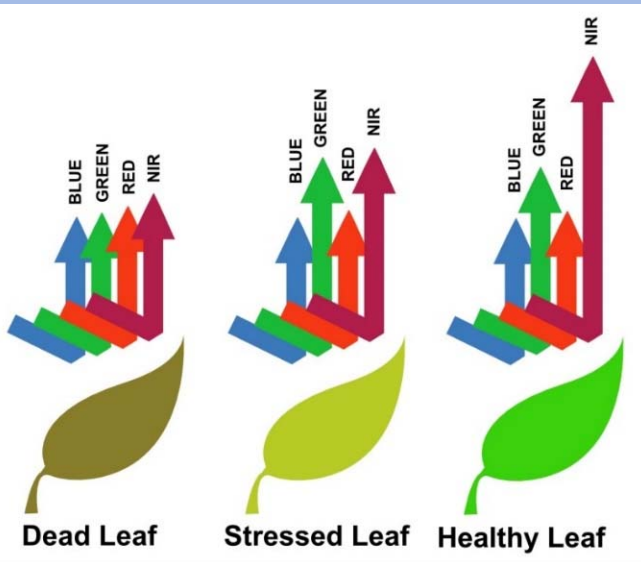
# How satellite collects the data?



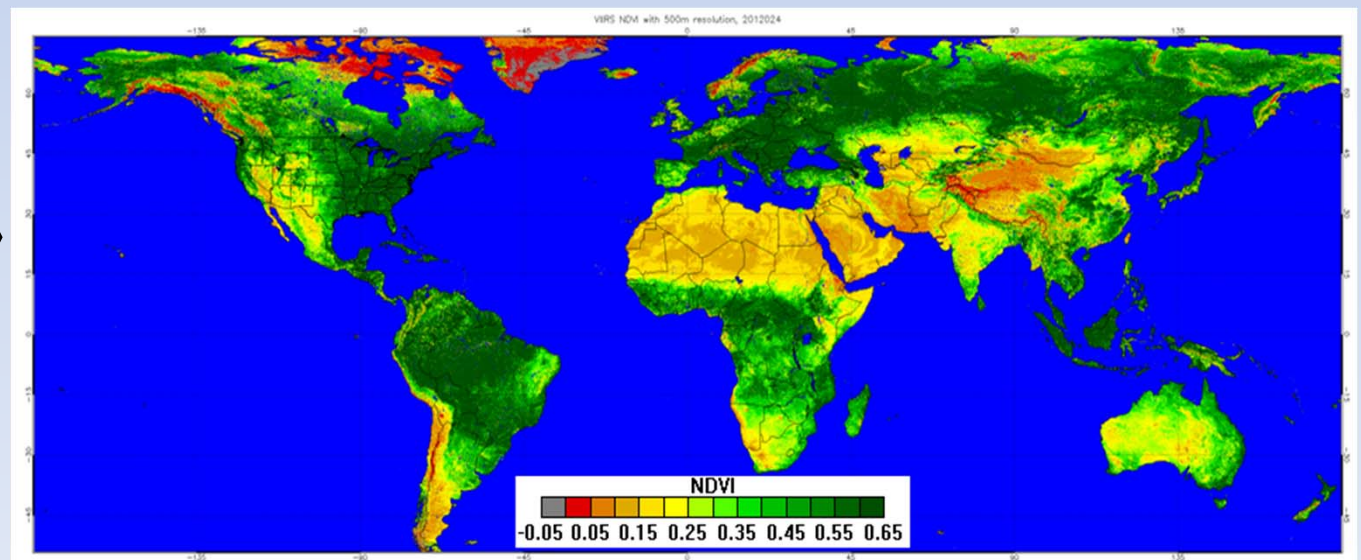
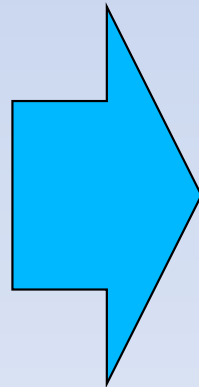
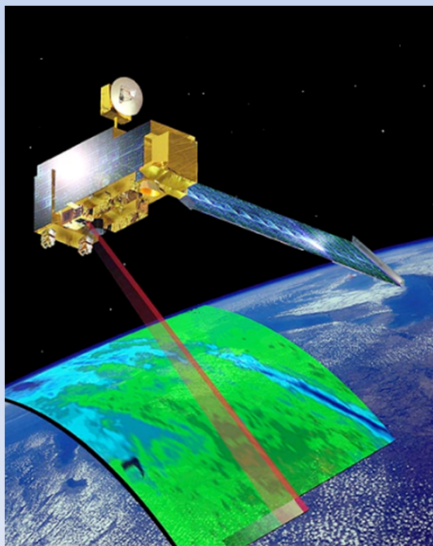
# Landsat Thematic Mapper Imagery

Band	Wavelength	Useful for mapping
Band 1 – Blue	0.435 - 0.451	Coastal and aerosol studies
Band 2 – Blue	0.452 - 0.512	Bathymetric mapping, distinguishing soil from vegetation, and deciduous from coniferous vegetation
Band 3 - Green	0.533 - 0.590	Emphasizes peak vegetation, which is useful for assessing plant vigor
Band 4 - Red	0.636 - 0.673	Discriminates vegetation slopes
Band 5 - Near Infrared (NIR)	0.851 - 0.879	Emphasizes biomass content and shorelines
Band 6 - Short-wave Infrared (SWIR) 1	1.566 - 1.651	Discriminates moisture content of soil and vegetation; penetrates thin clouds
Band 7 - Short-wave Infrared (SWIR) 2	2.107 - 2.294	Improved moisture content of soil and vegetation and thin cloud penetration
Band 8 - Panchromatic	0.503 - 0.676	15 meter resolution, sharper image definition
Band 9 – Cirrus	1.363 - 1.384	Improved detection of cirrus cloud contamination
Band 10 – TIRS 1	10.60 – 11.19	100 meter resolution, thermal mapping and estimated soil moisture
Band 11 – TIRS 2	11.50 - 12.51	100 meter resolution, Improved thermal mapping and estimated soil moisture

# Remote Sensing of Vegetation (crop/forest)

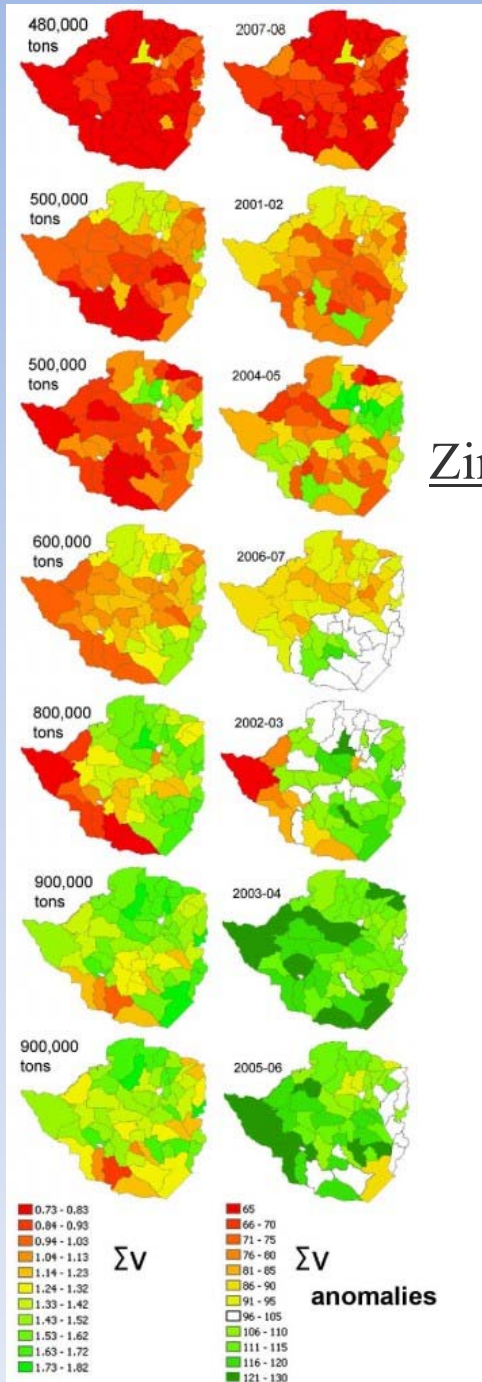


Ratios of reflectance's at different wavelengths can indicate vegetation density and health





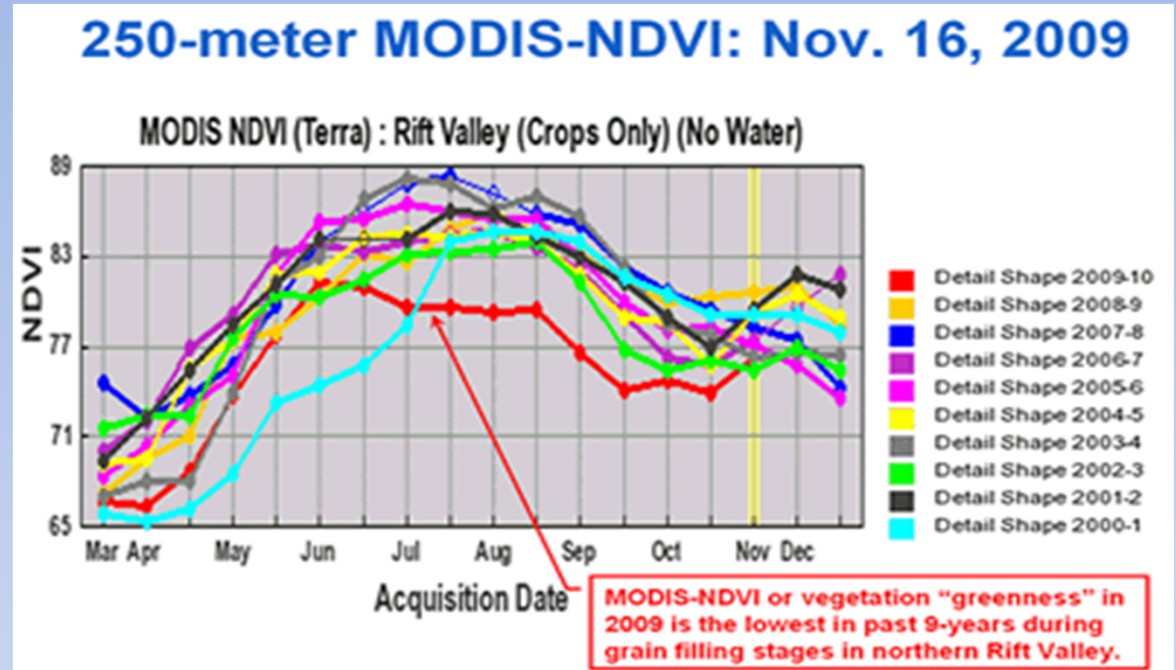
# Vegetation Index (NDVI) for Food Security



Zimbabwe

$\Sigma v$  relies on measures of vegetation condition (NDVI) throughout the growing season to assess the likely production outcome.

Budde et al (2010)



Nationally, 2008 ranks as worst year since 2000



Irrigated Areas

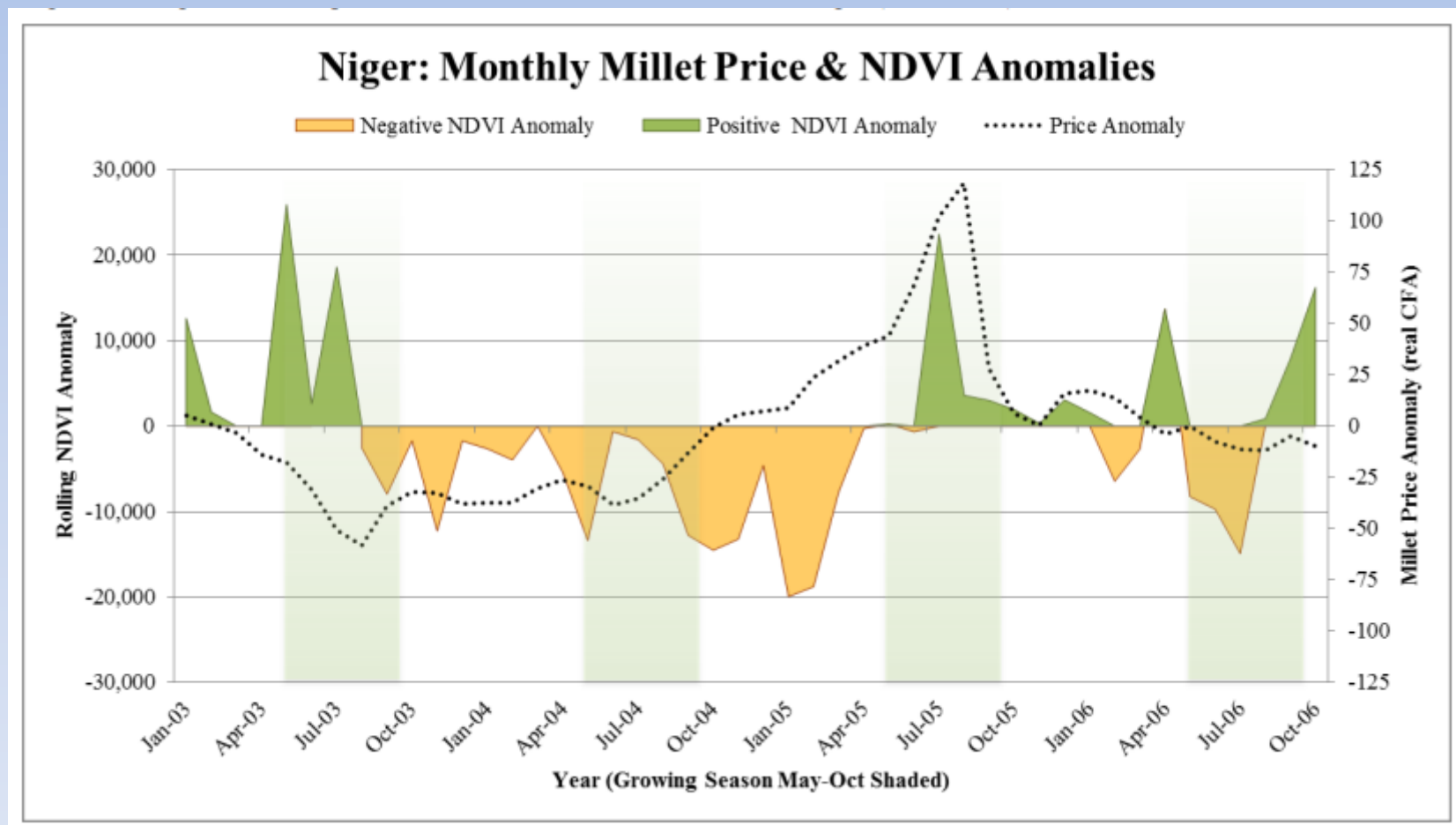
Year	Maximum NDVI	Yield (t/ha)
2003	0.381	2.85
2007	0.373	2.69
2005	0.364	2.51
2006	0.357	2.58
2002	0.355	2.02
2004	0.335	1.93
2000	0.320	1.12
2001	0.317	1.31
2008	0.313	1.14*

\* Estimated based on regression of maximum NDVI and historical yield figures



# Food price and NDVI

- Can we effectively use NDVI to analyze food Security crises?



# Example of vegetation mapping at high resolution

Unmanned Aerial Vehicle (UAV)

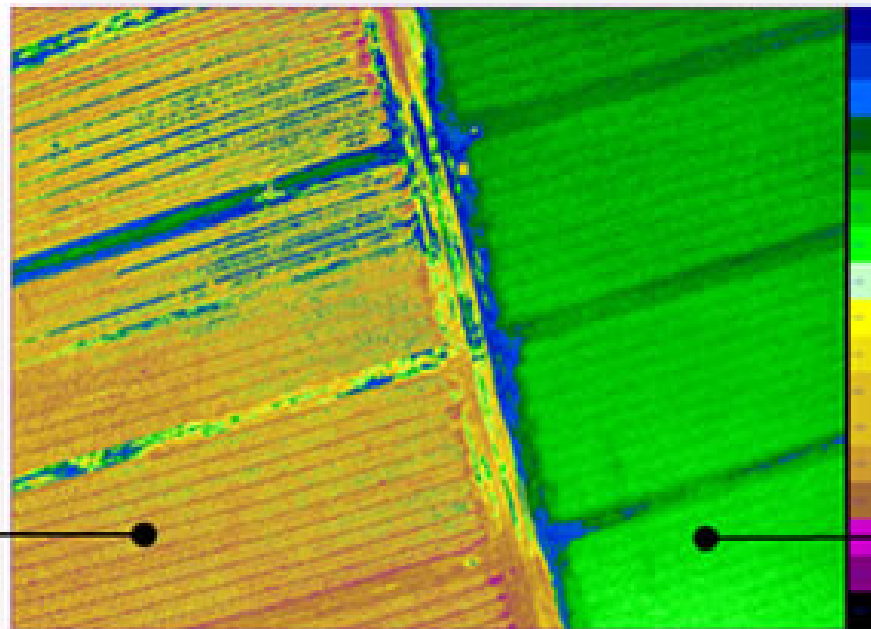


5

$$\text{NDVI} = \frac{\text{NIR} - \text{VIS}}{\text{NIR} + \text{VIS}}$$



Stressed Vegetation

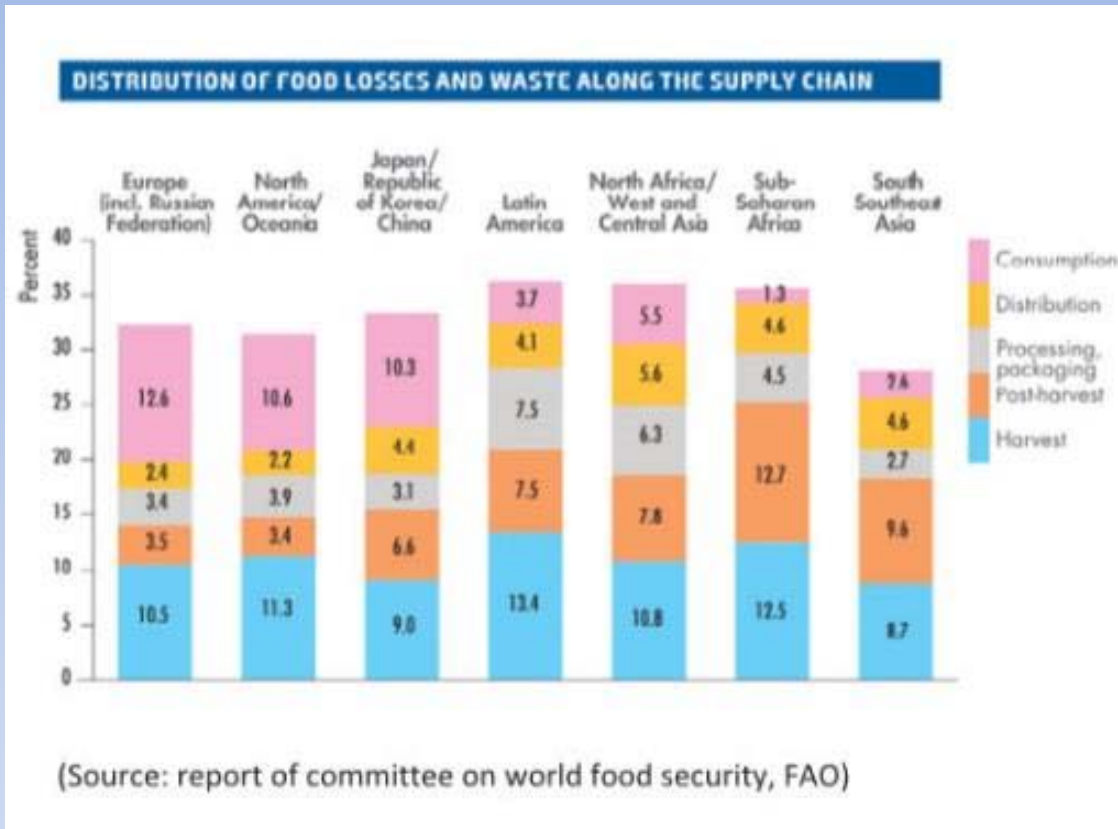


Healthy Vegetation

6

Aerial NDVI Image

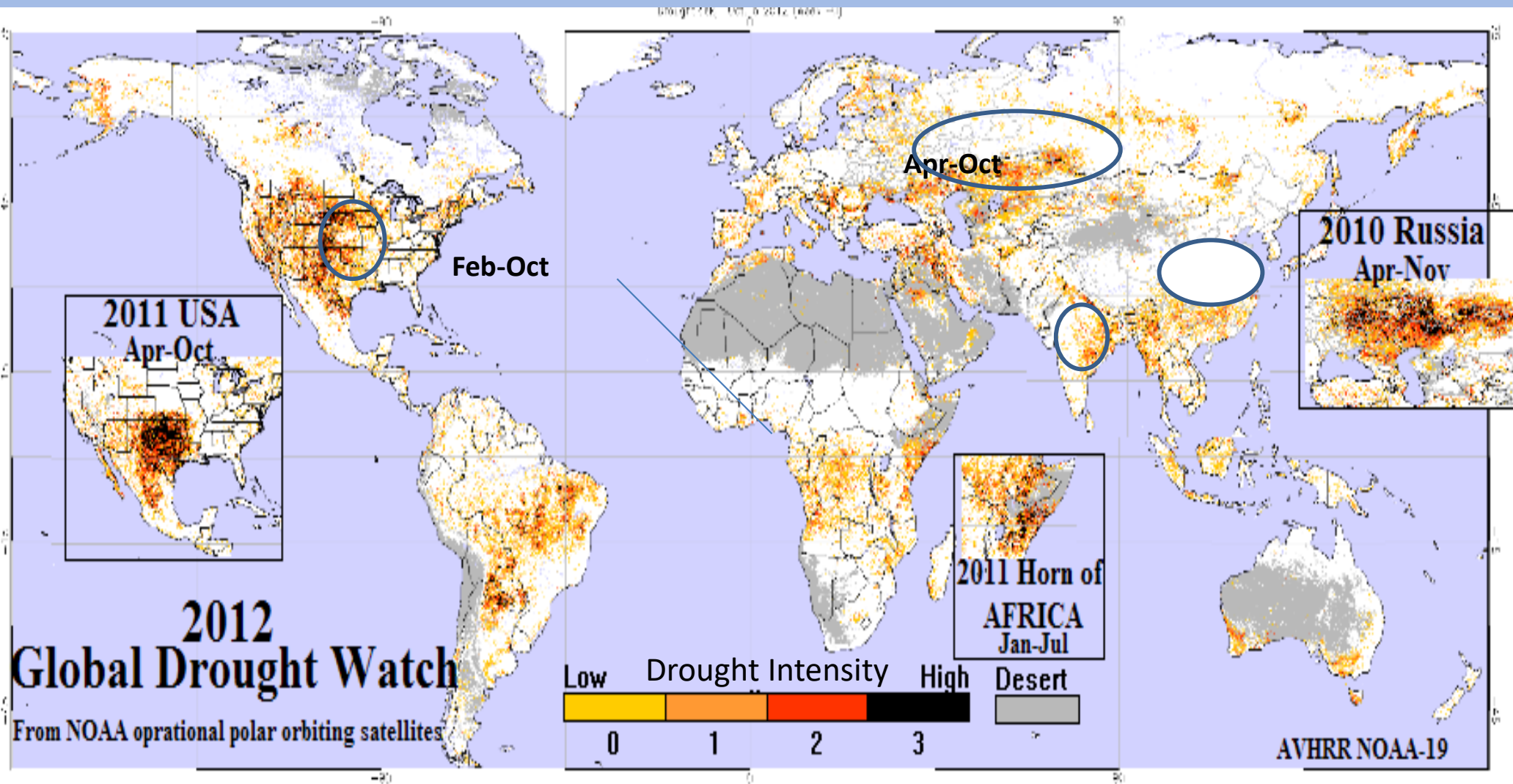
# Monitoring of Food Production



- Multiple handling points along with lack of quality control points from farm to consumer is the root cause of wastage.

For example: Alphonso mangoes transported in extreme summer from Konkan to Mumbai go through heat stress even in temperature-controlled trucks.

# Global droughts from operational satellites



- 2012- Extreme drought in the USA, southern UKRAINE, northern KAZAKHSTAN,
  - Severe drought in eastern INDIA, Kenya & South America
- 2011 – Exceptional drought in Texas (USA) and the Horn of AFRICA
- 2010 - Exceptional drought in RUSSIA and UKRAINE

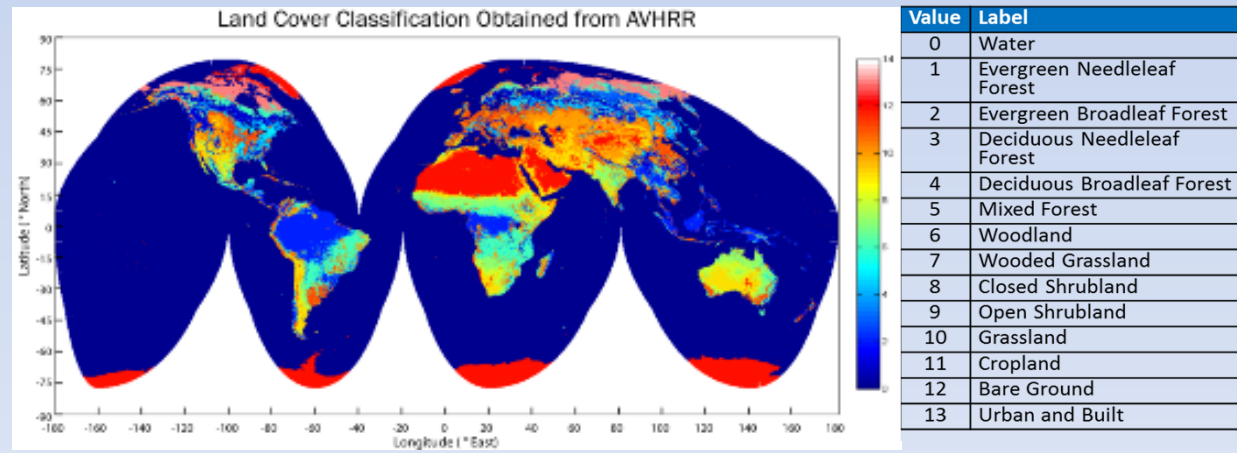


# Land Cover (including Vegetation Type)

- Land cover affects and is affected by global climate change in important ways. First, the interaction of land cover and the atmosphere causes a regulation of the hydrologic cycle and energy budget, which makes it necessary for weather and climate prediction.
- Land cover also plays a major role in the carbon cycle by acting as a source and a sink of carbon.
- Ongoing global land cover monitoring system integrates information from three common observational scales:
  - Moderate resolution satellite data (e.g. AVHRR, MODIS or MERIS type satellite sensor);
  - fine resolution satellite data (from Landsat and SPOT type satellite sensors); and
  - in situ observations (or very high resolution remote sensing data: IKONOS, QuickBird, aerial photo).
- Synergistic use of optical and active remote sensing (i.e., RADAR and LIDAR) data sources are improving the land cover characterization.



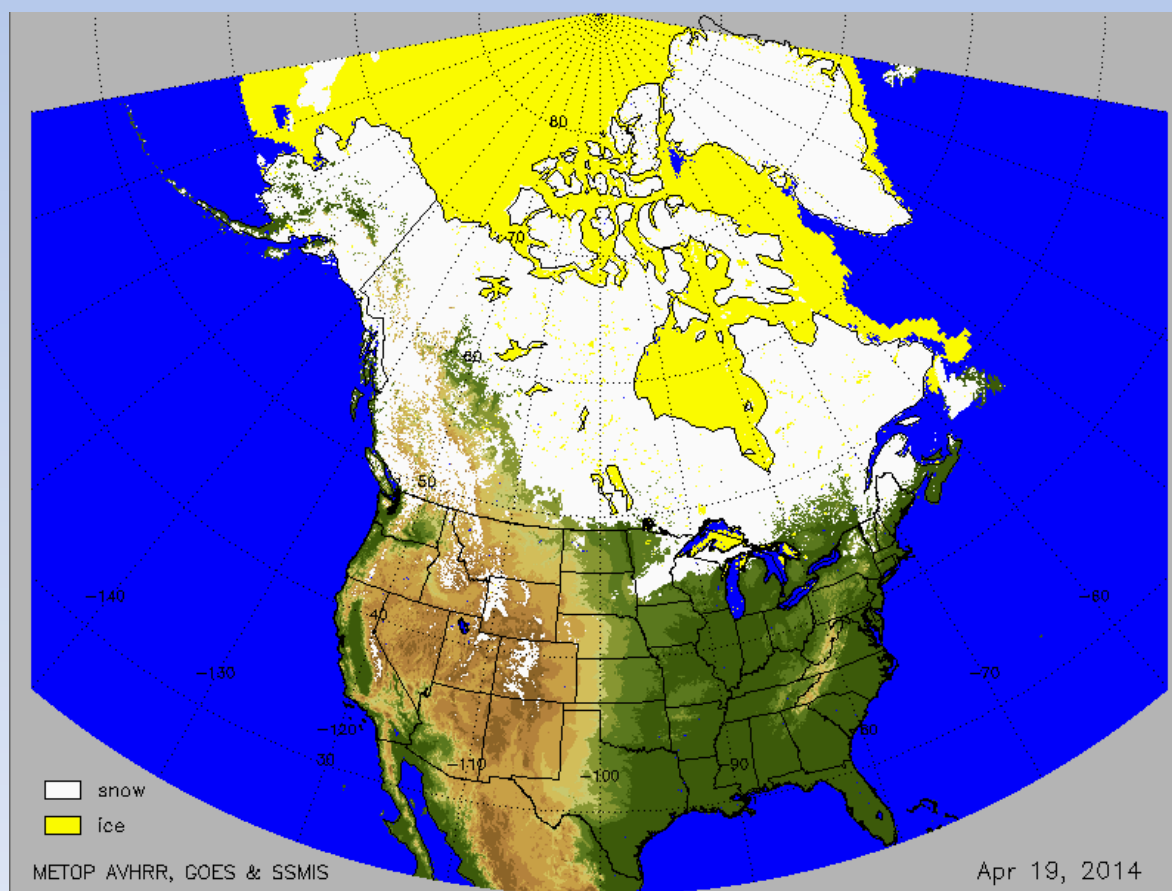
Land Cover Properties from Satellites  
(European Commission Joint Research Centre, Ispra)



# Automated snow mapping system

The automated snow mapping system uses synergy of observations in the visible, infrared and microwave spectral bands from operational polar orbiting and geostationary satellites to generate daily global maps of snow and ice cover.

The current version of the system incorporates data from the following satellite sensors: METOP-A AVHRR, DMSP F-16,-17 and -18 SSMIS, GOES-East and -West Imager, MSG SEVIRI

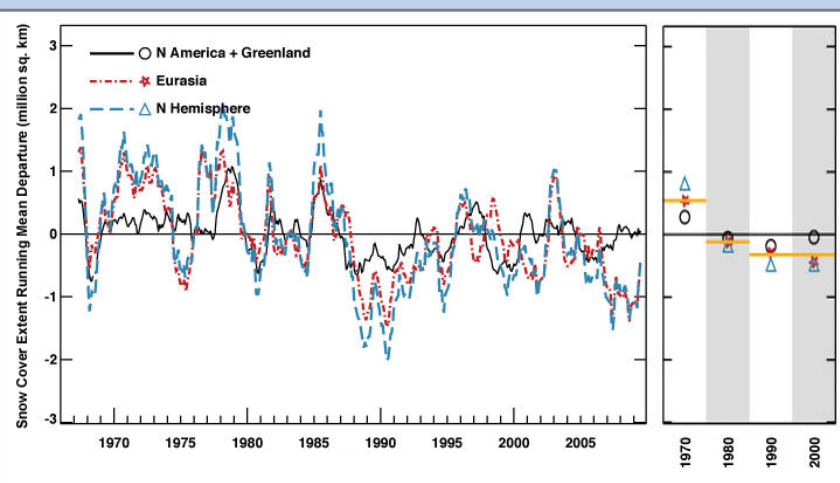


Product developed by:  
Dr. Peter Romanov  
(NOAA-CREST)

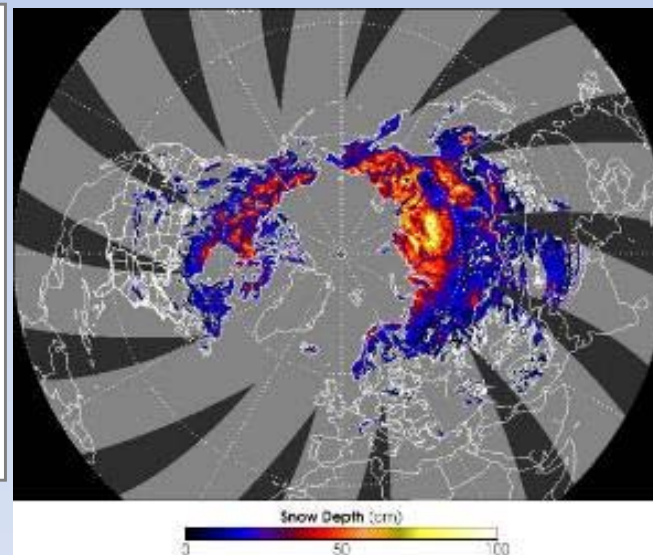
<http://www.star.nesdis.noaa.gov/smcd/emb/snow/HTML/snow.htm>

# Snow Cover Extent

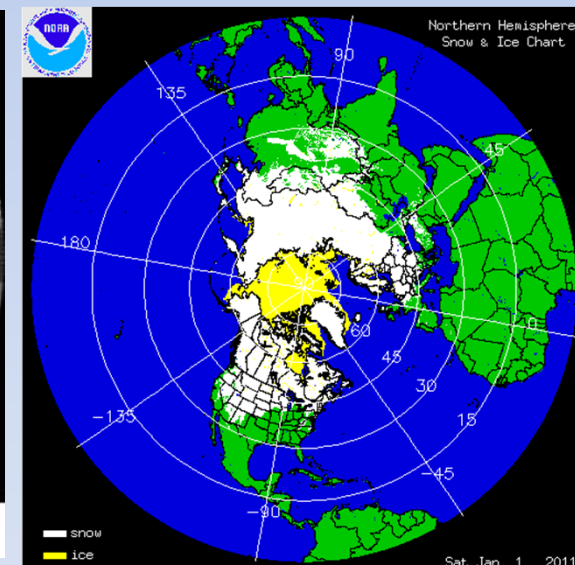
- Since 1966 NOAA has produced weekly snow extent charts for Northern Hemisphere land surfaces using visible-band satellite imagery.
- Due to the ability to penetrate most clouds, provide data during darkness, and to provide a measure of snow depth or water equivalent, passive microwave remote sensing can enhance snow measurements based on optical data alone.



Mean SCE anomalies (in million sq. km) by continent for the period of record. Decadal average departures are shown in orange. Normals based on 1971-2000. Source: State of the Climate, BAMS 2009 Vol. 91.



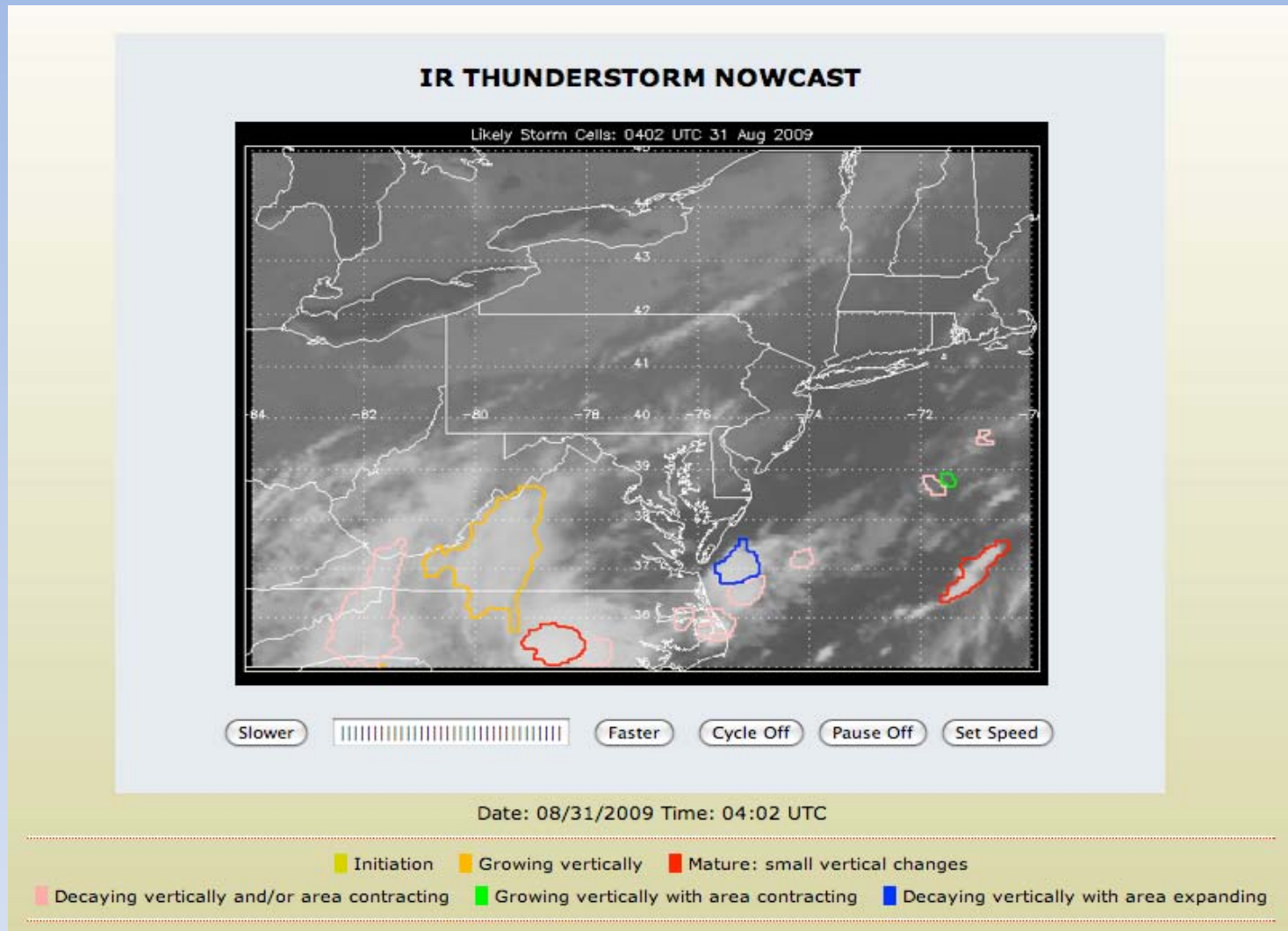
Snow depth derived from EOS (AMSR-E) on the [Aqua](#) satellite.



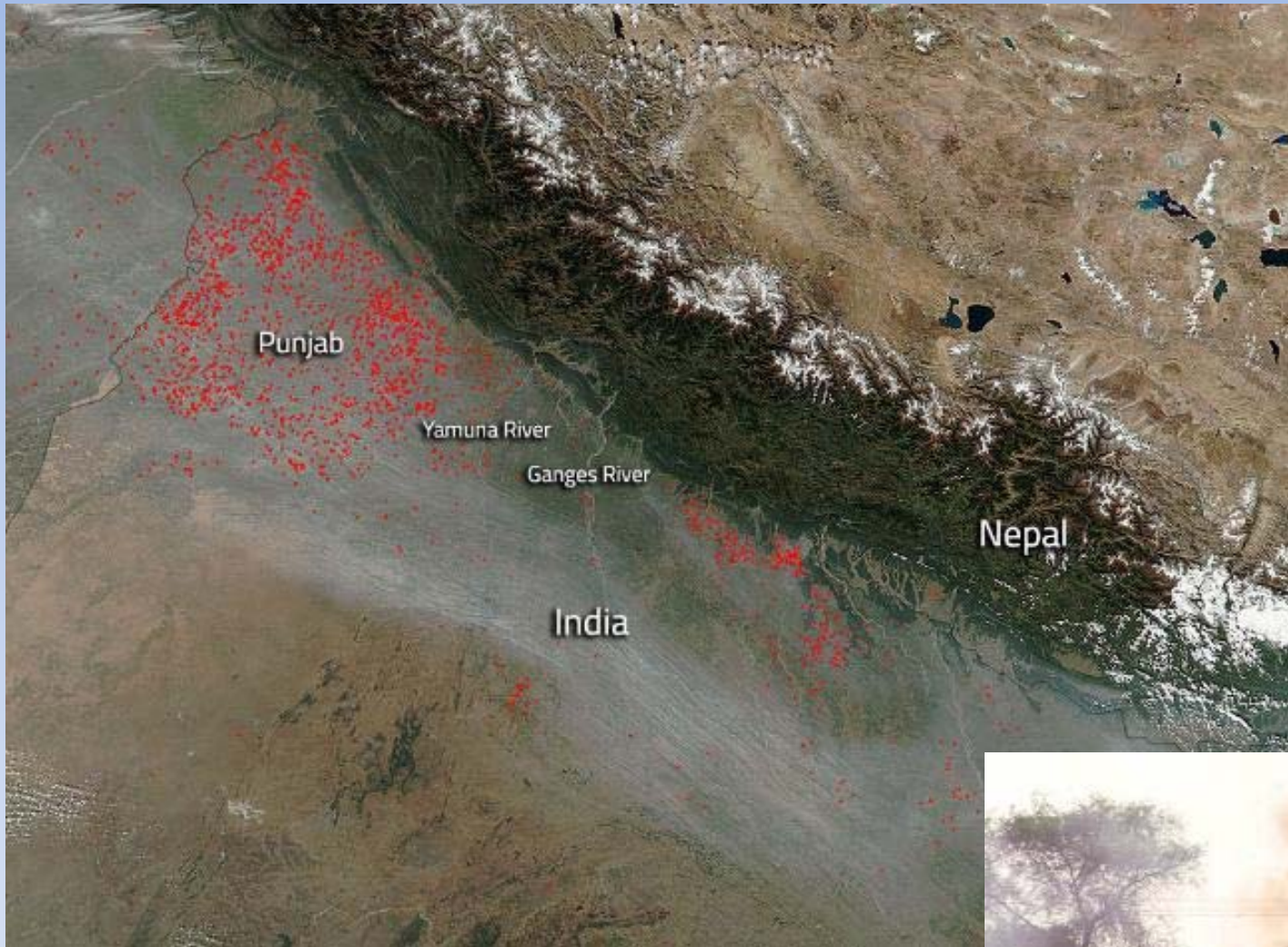
Operational products of areal extent of snow Cover by Interactive Multisensor Snow and Ice Mapping System (IMS) Daily Northern Hemisphere Snow & Ice Analysis.



# NOAA-CREST Satellite Receiving Station



# Agriculture Fire

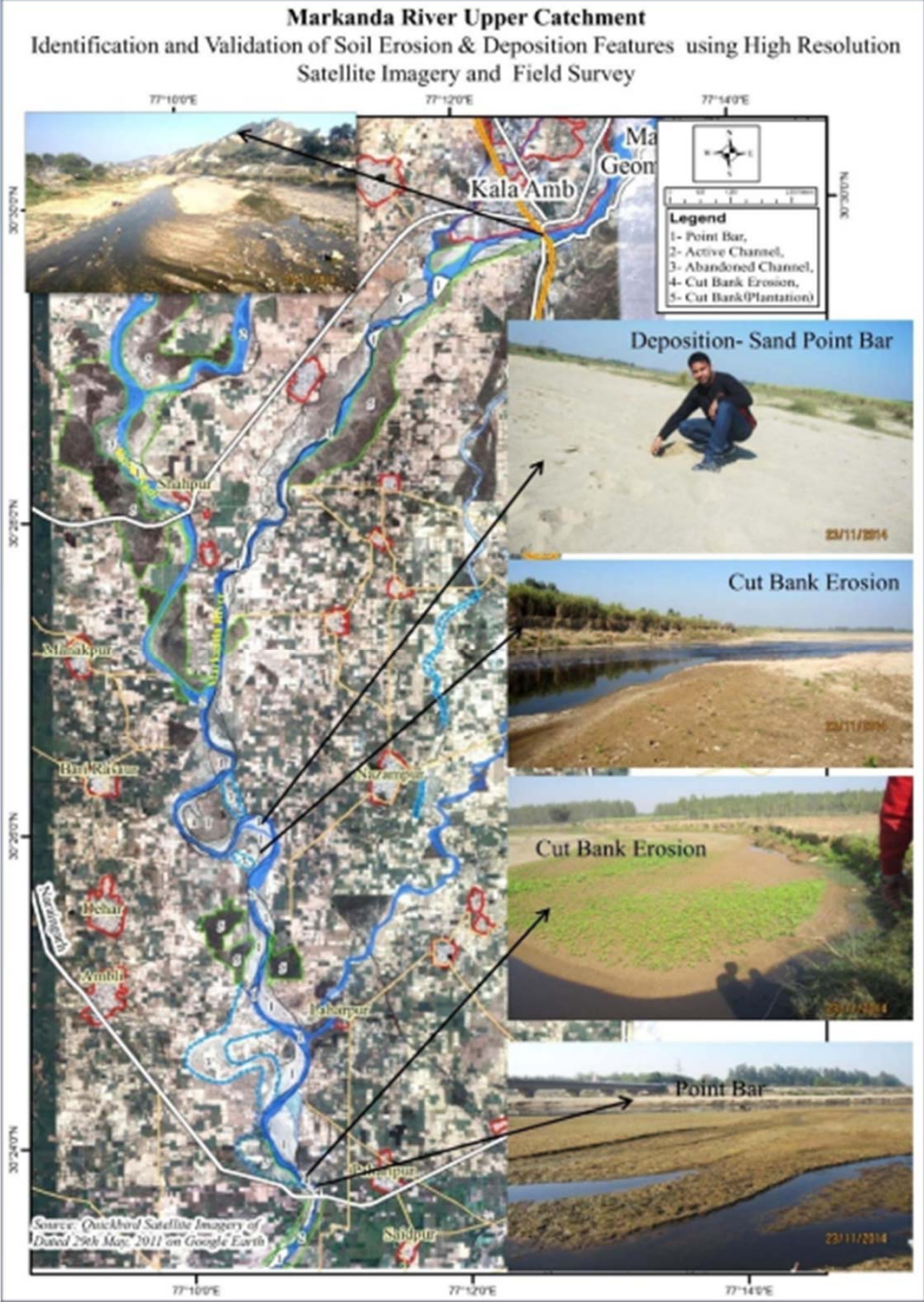
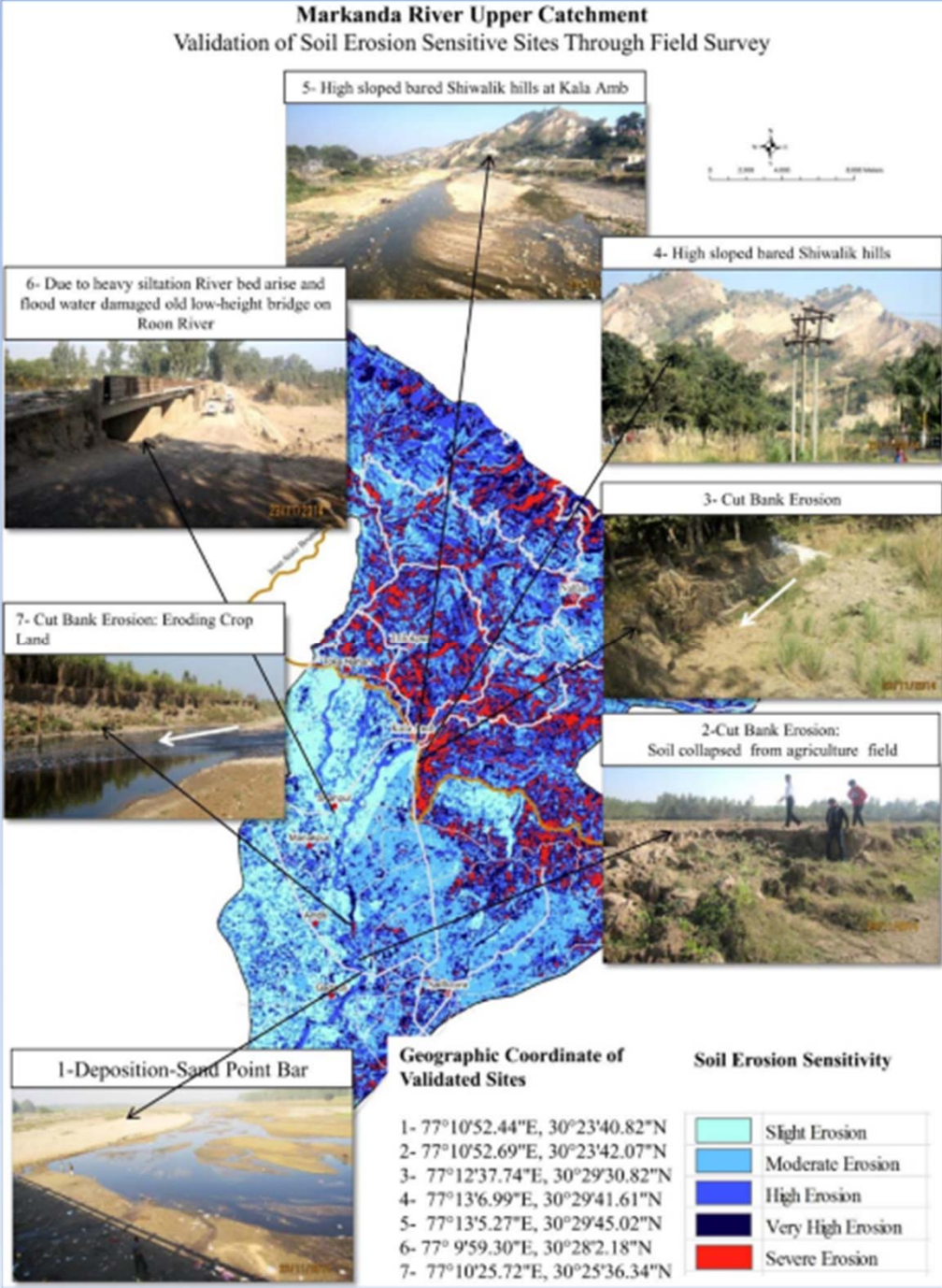


NASA's Suomi NPP Satellite Shows Agricultural Fires



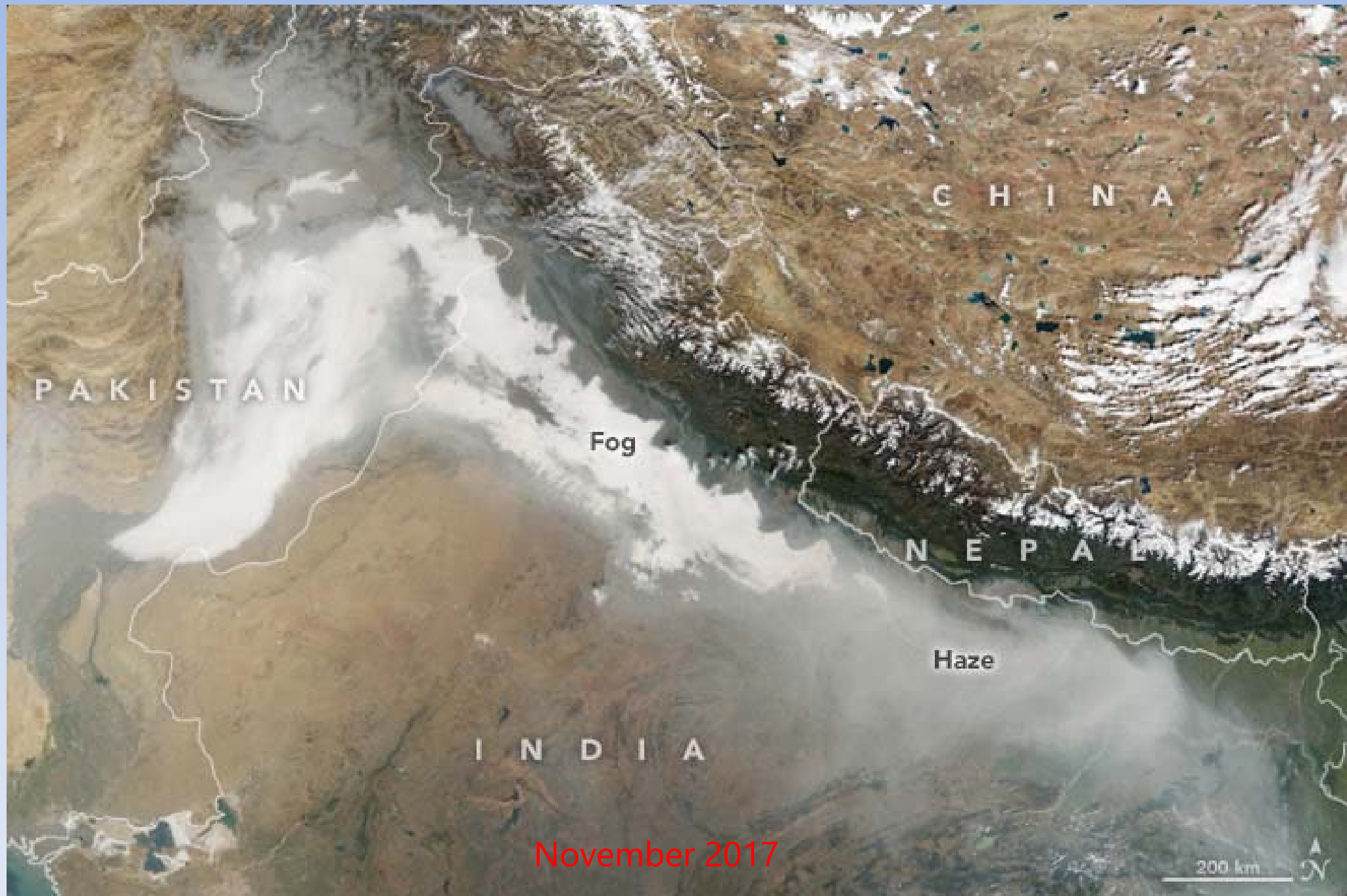


# Soil Erosion Mapping





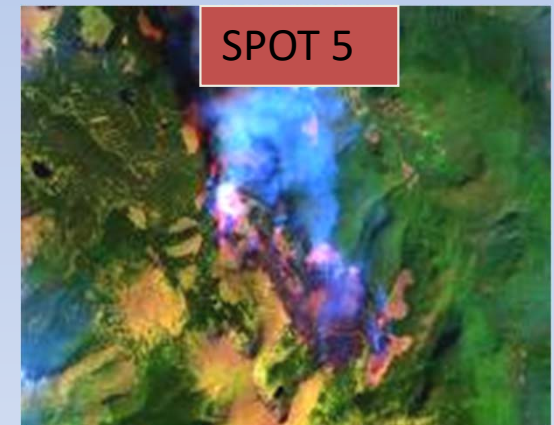
# MODIS Satellite Data for Fog and Haze



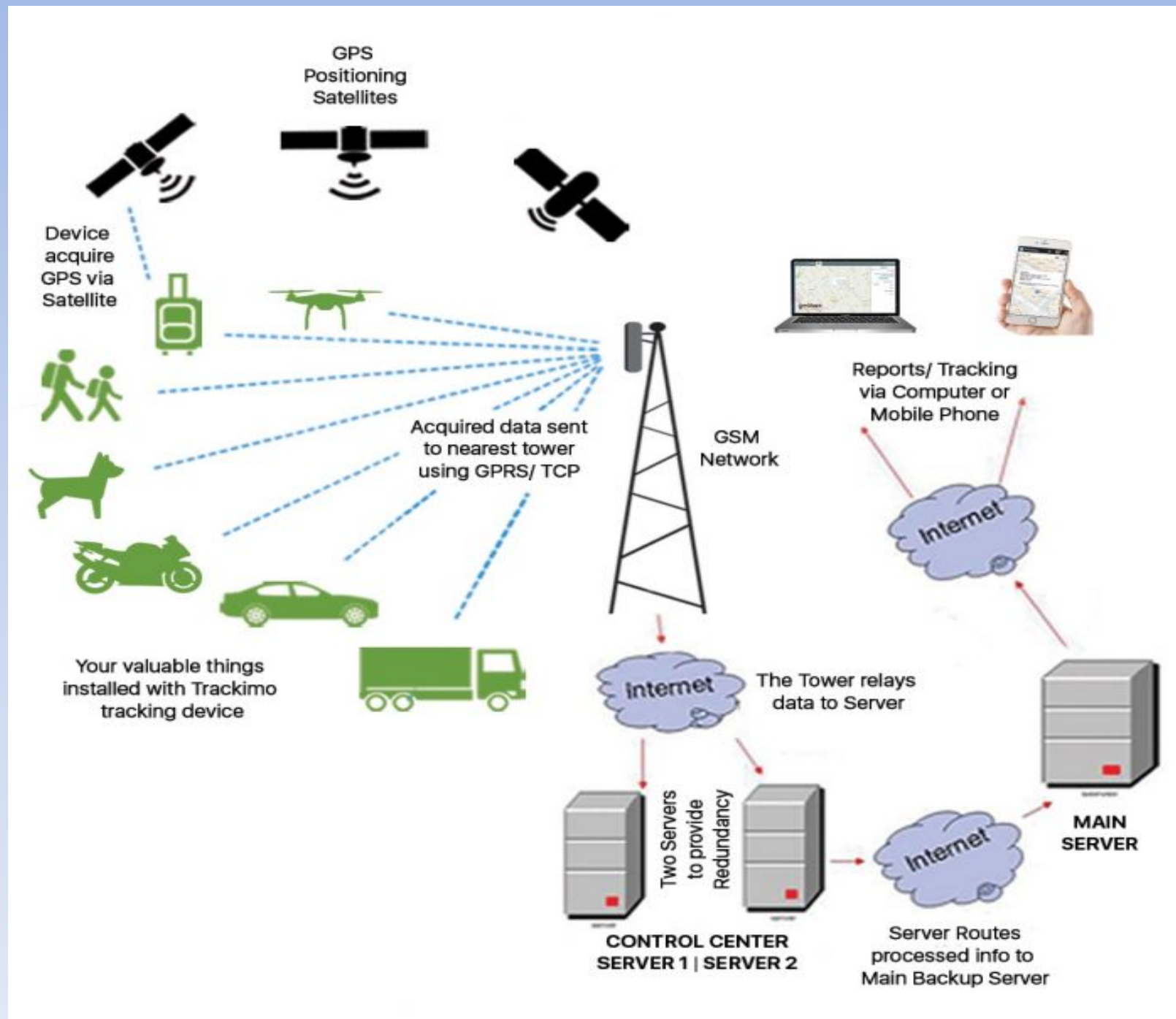
# Satellite data for crop/vegetation mapping

## Some satellite imagers:

- Landsat 1-8 (1972 – now) 30m Resolution
- SPOT 1-7 (1986-now) 1.5m Resolution
- IKONOS (1999) 0.8m Resolution
- Quickbird 1-2 (2000) 0.61m Resolution
- RESOURCESAT 1-2A (2003) 5.8m Resolution
- ASTER (2000) 15m Resolution
- MODIS (2002 – now) 250m Resolution
- AVHRR (1998 – now) 1.1km Resolution

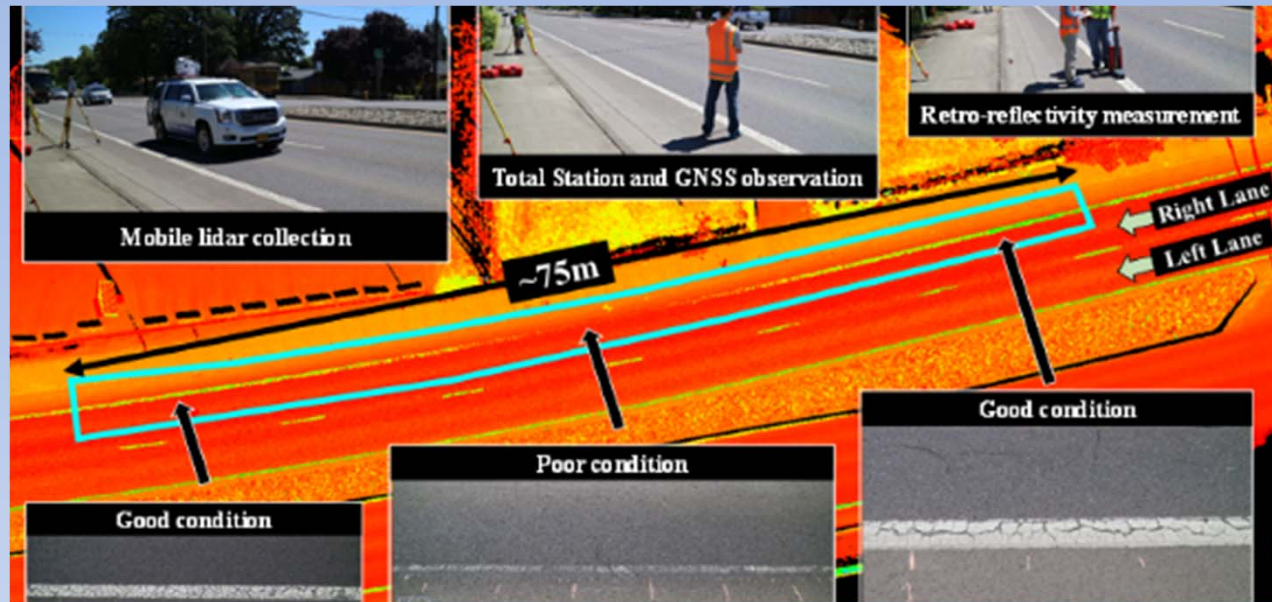


# GPS and Tracking





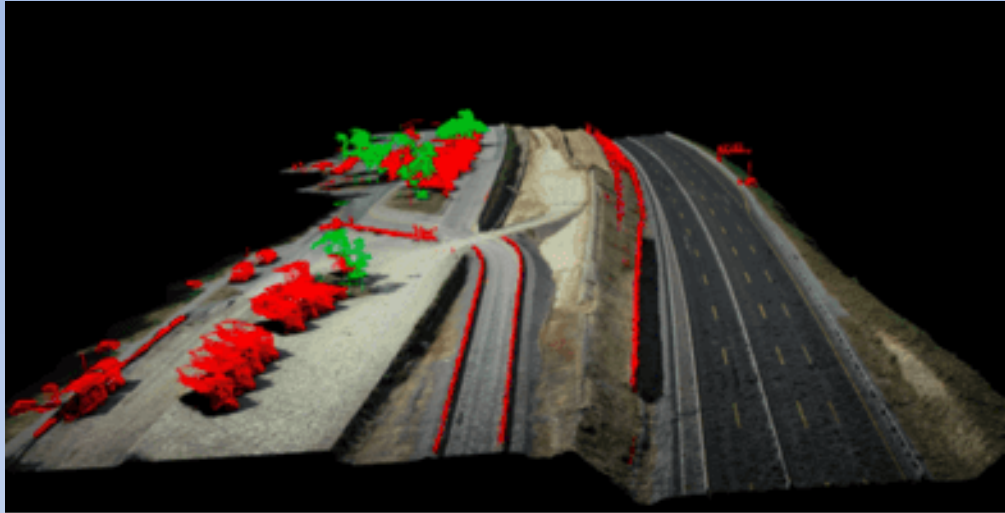
# Drone for Civil Engineering



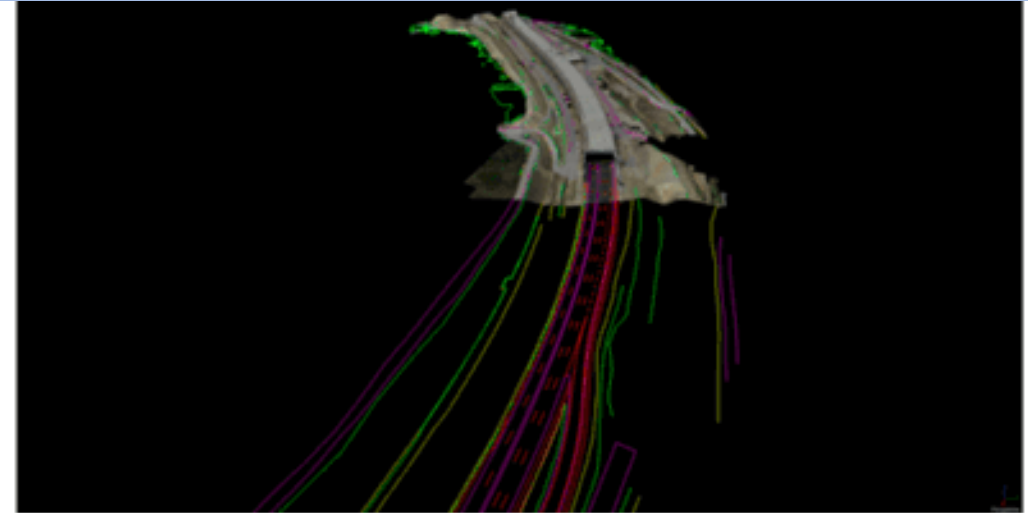
Construction Surveying to Create Precise 3D Models



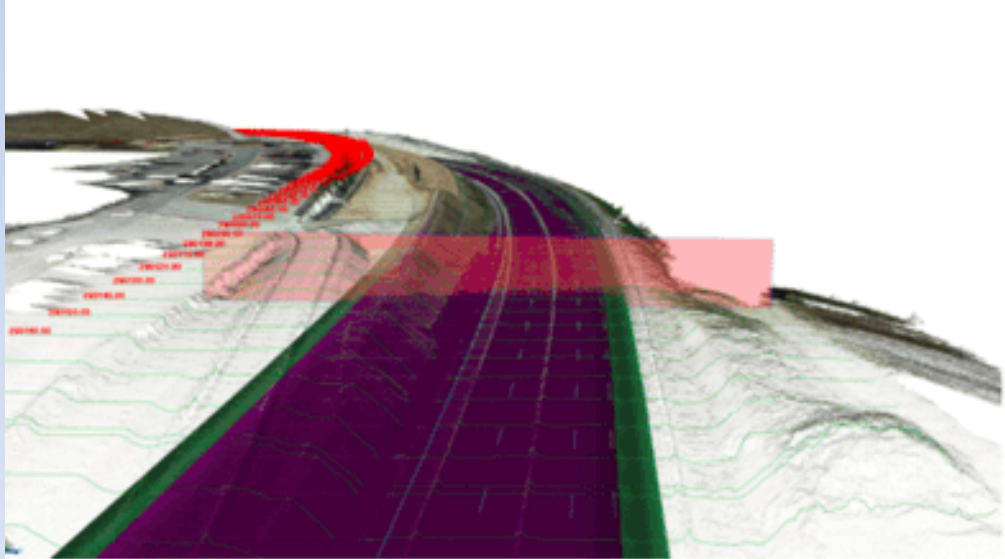
# LiDAR for Digital terrain and surface modelling



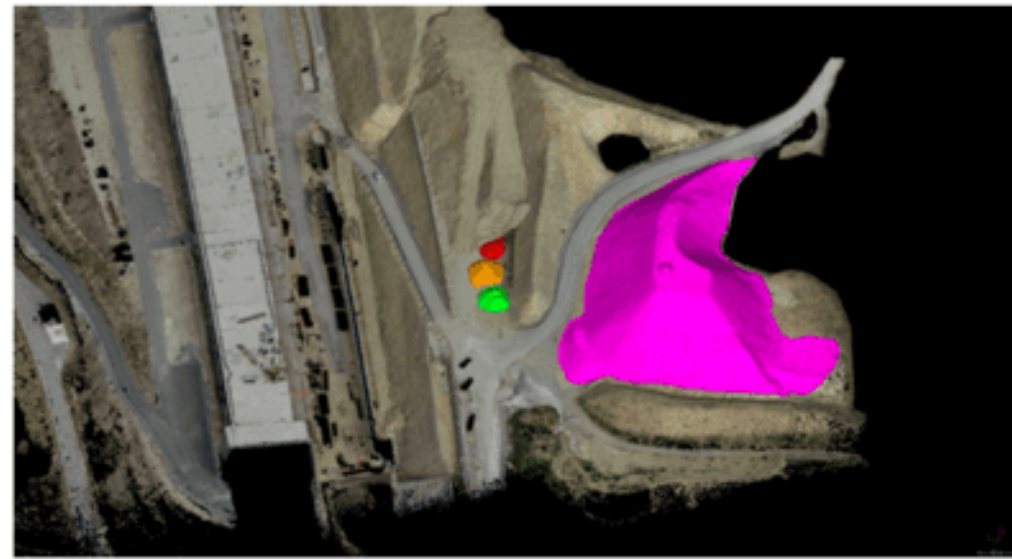
*Point cloud classification*



*Vectorization*



*Building information modelling (BIM)*



*Volume and mass calculation*



# Snow-Melt Flood in Nepal



The Moderate Resolution Imaging Spectro-radiometer (MODIS) on NASA's [Aqua](#) satellite observed the flooding on May 30, 2013.



# Snow-Melt Flood in Nepal

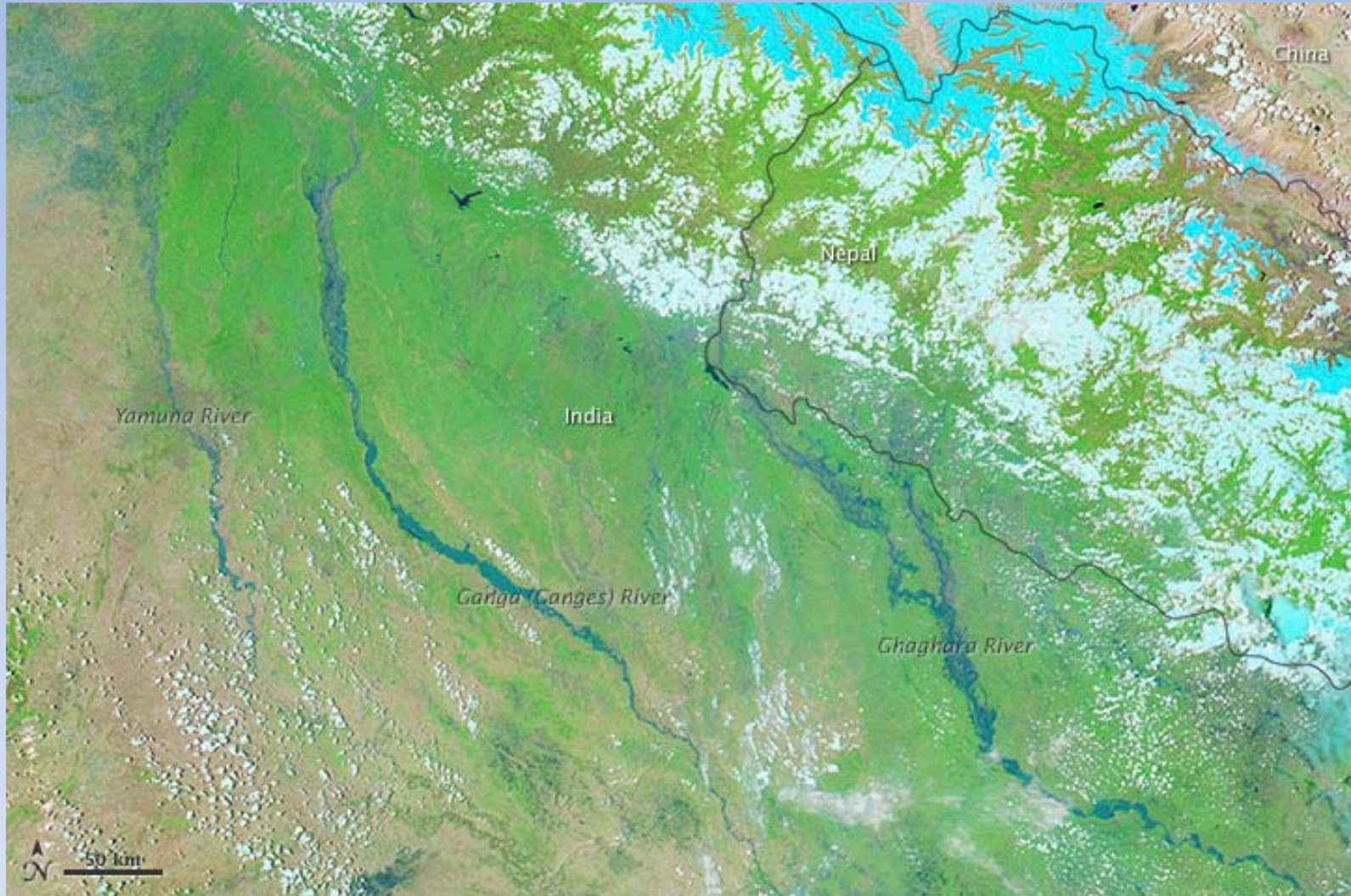


Image taken on June 21, 2013, showing flooding area

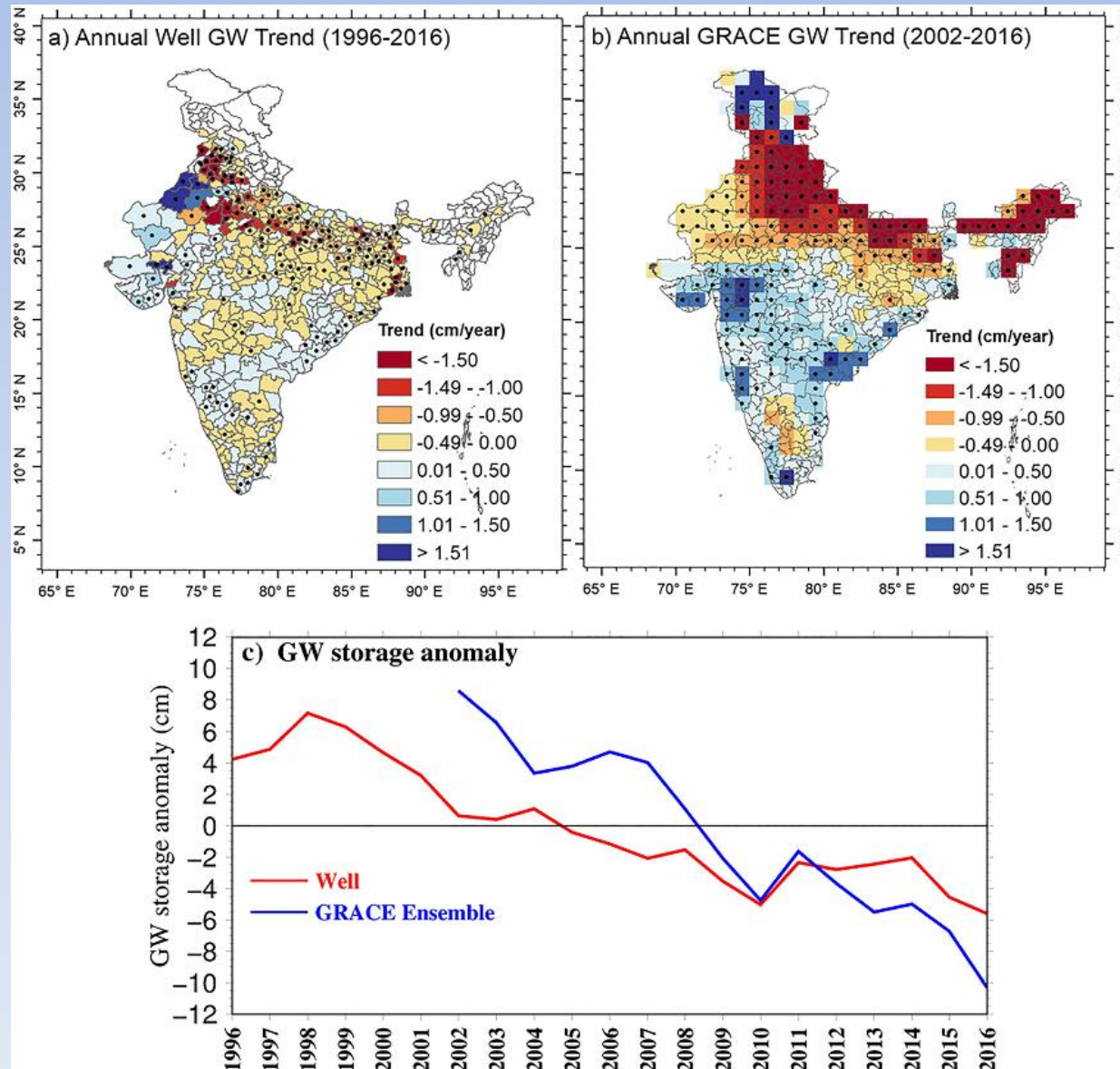


# Monitoring Urban Floods Using Remote Sensing



# Groundwater

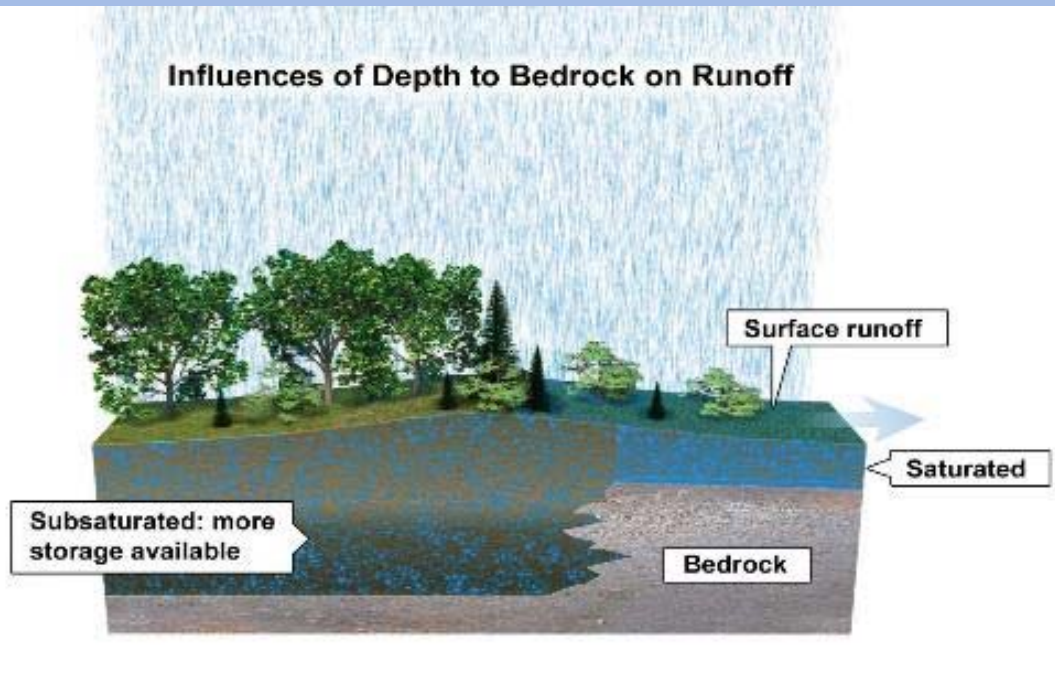
- Groundwater storage variations using the Gravity Recovery and Climate Experiment (GRACE) mission has been demonstrated by measuring subtle temporal variations in gravity.





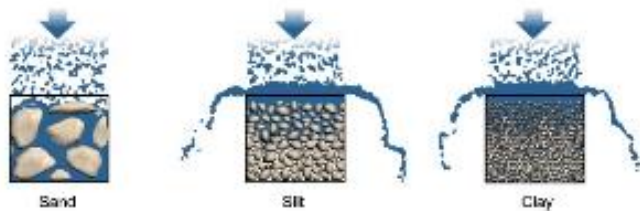
# Soil moisture

Influences of Depth to Bedrock on Runoff



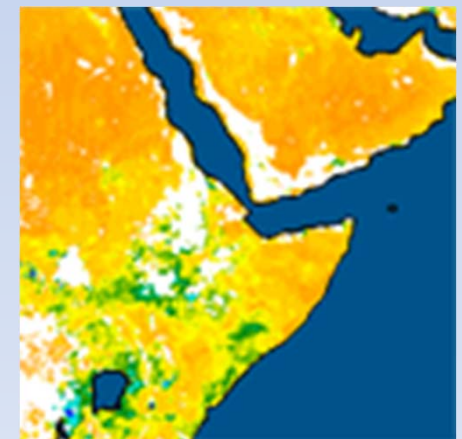
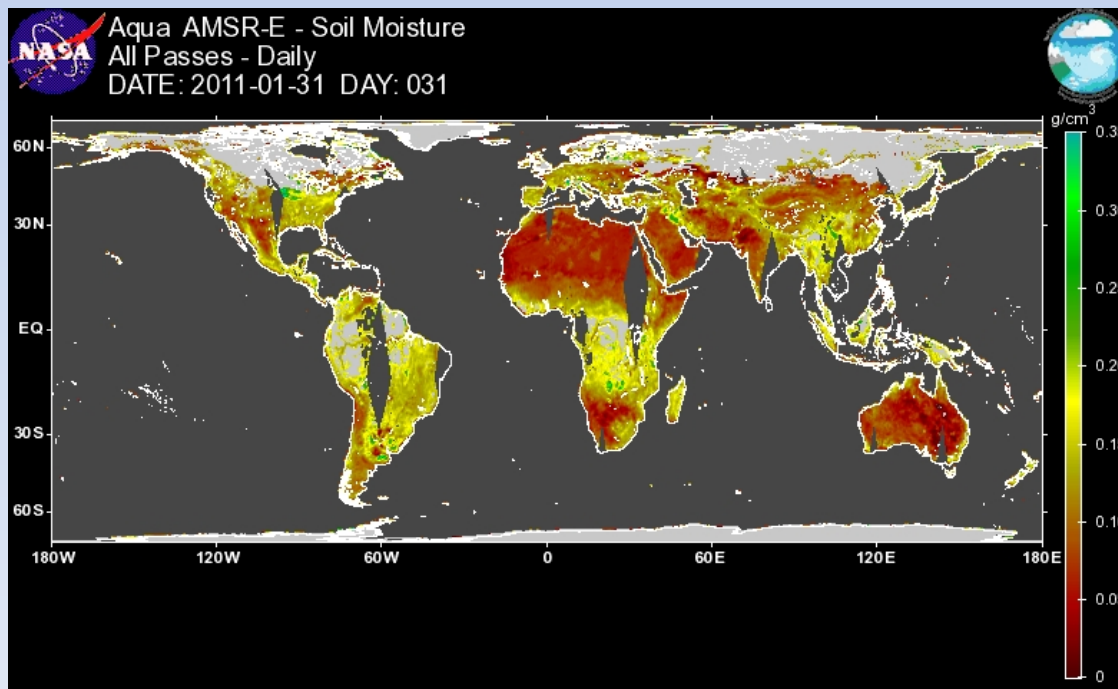
- Weather prediction modeling
- Hydrological modeling
- Flash flood warnings
- Soil erosion/ mud slide
- Improving crop yield (Irrigation scheduling)
- Optimize use of agro-chemical.

Infiltration Variations by Soil Texture



# Soil Moisture

- **ERS-1 and ERS-2:** C-Band Scatterometer, ESA, 1991-2010.
- **AMSR-E:** Multi-frequency radiometer, NASA/JAXA, 2002-2011.
- **ASCAT:** C-Band Scatterometer, EUMETSAT/ESA, 2006-2020.
- **Coriolis WindSat:** Multi-frequency polarimetric radiometer, 2003-Current
- **SMOS:** L-band radiometer, ESA, 2010-Current.
- **SMAP:** L-band radiometer, NASA, Launch in 2014.



SMOS Soil moisture Map  
2011. Source: ESA

# What Do Satellite Sensors See?

— VIS, IR & Thermal IR

— MW (low frequency-  
emission by rain)

— MW (high frequency-  
scattering by ice)

— Radar

ICE

-10

Mixed

0

Liquid

Average rain drop  
size - 2 millimeters

Average cloud droplet  
size - 0.02 millimeters



Average condensation  
nucleus size -  
0.0002 millimeters

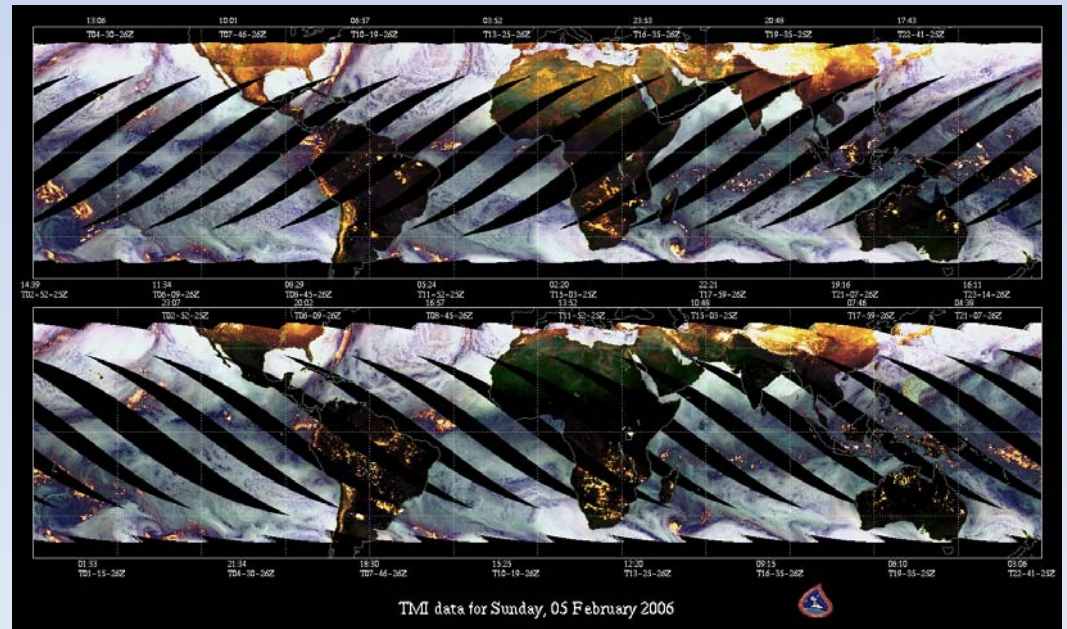
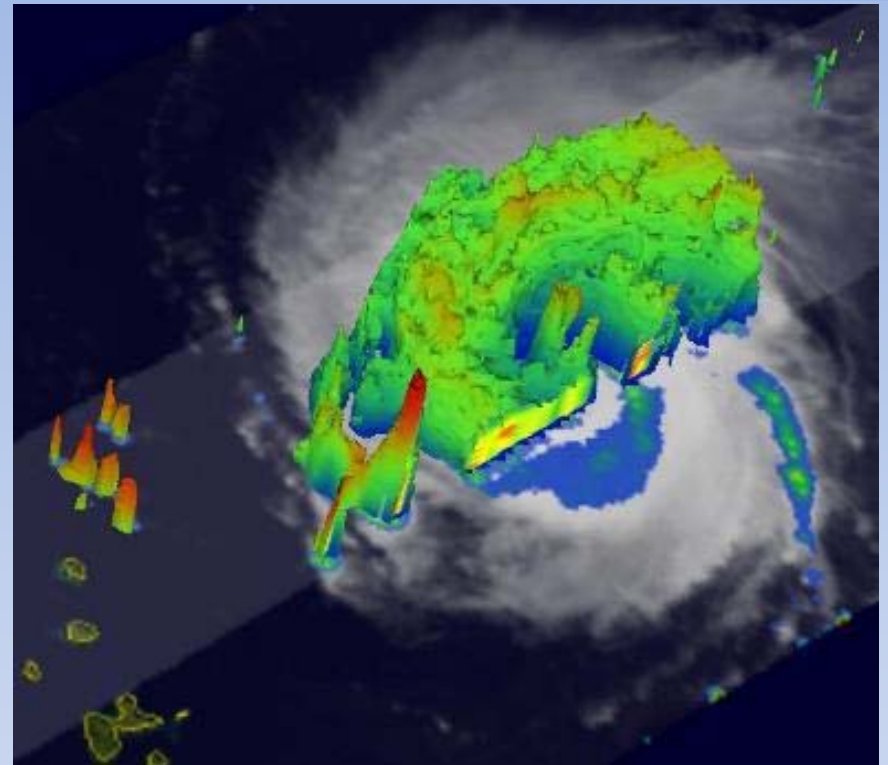




# GOES, SSMI, TRMM Cloud Rainfall image



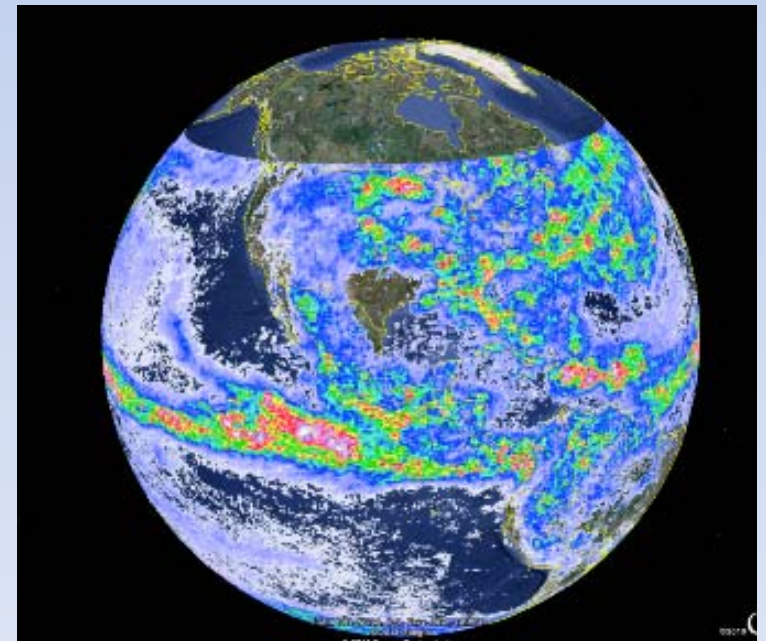
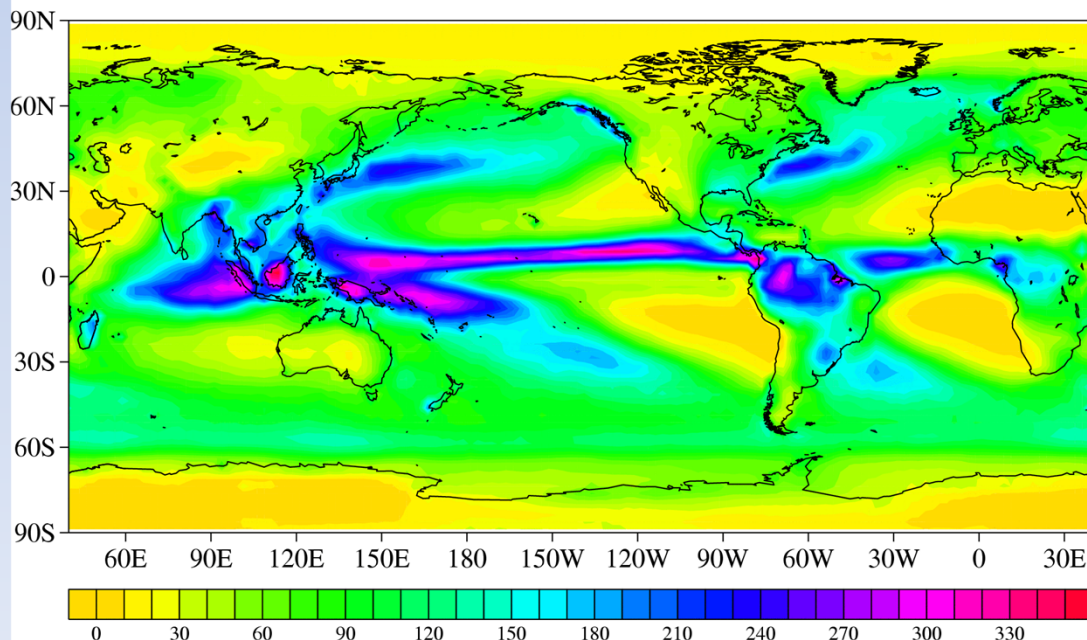
GOES VIS/IR Cloud image



# Global Precipitation Products

- **Global Precipitation Climatology Project (GPCP)**
  - Data from over 6,000 rain gauge stations, and satellite geostationary and low-orbit infrared, passive microwave, and sounding observations have been merged to estimate monthly rainfall on a 2.5-degree global grid from 1979 to the present.
- **Tropical Rainfall Measuring Mission (TRMM)**
  - TRMM consist of: Precipitation Radar (PR), TRMM Microwave Imager (TMI), Visible and InfraRed Scanner (VIRS), Cloud and Earth Radiant Energy Sensor (CERES), Lightning Imaging Sensor (LIS)
  - Produce Global (Between Latitude 35 N and 35 S) Real-Time 3-Hourly Precipitation Analysis.
- **NOAA - CPC Merged Analysis of Precipitation (CMAP)**
  - Monthly and pentad global gridded precipitation means. It includes a standard and enhanced version (with NCEP Reanalysis) from 1979 to near the present.

Annual total precipitation (cm, GPCP)



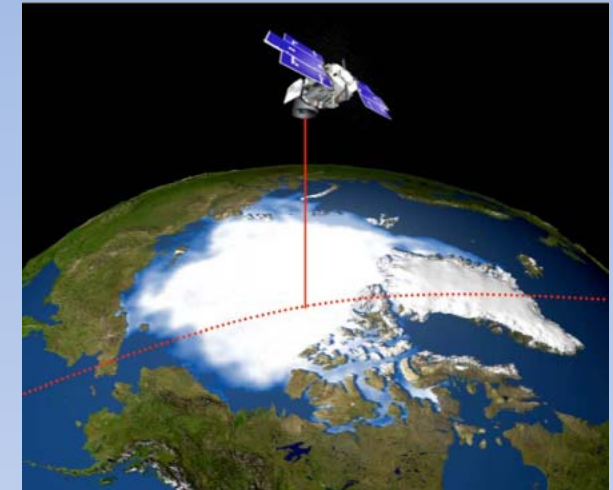
TRMM Precipitation



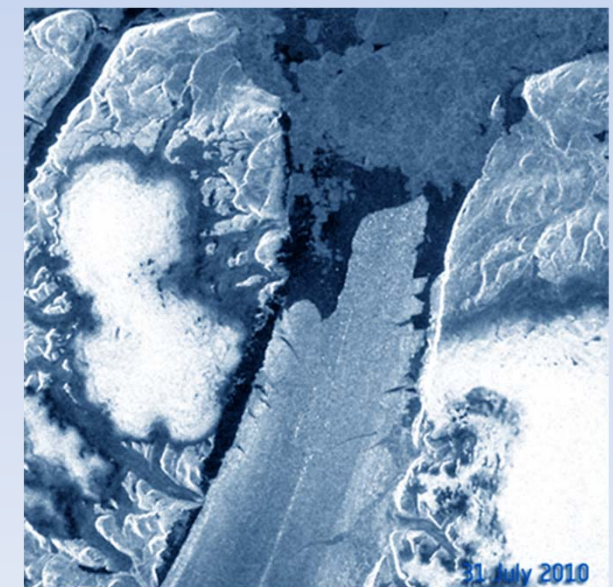
# Glacier and Ice Caps

- Changes in glaciers provide some of the clearest evidence of climate change, constitute key variables for early-detection strategies in global climate-related observations, and have the potential to cause serious impacts on sea level, the terrestrial water cycle and societies dependent on glacier melt water.
- ICESat (Ice, Cloud, and land Elevation Satellite) is the benchmark Earth Observing System mission for measuring ice sheet mass balance.
- From 2003 to 2009, the ICESat mission provided multi-year elevation data needed to determine ice sheet mass balance.
- ICESat-2 is scheduled for launch in early 2016.
- Objective of ICESat Mission:
  - Quantifying polar ice-sheet contributions to current and recent sea-level change and the linkages to climate conditions.
  - Quantifying regional signatures of ice-sheet changes to assess mechanisms driving those changes and improve predictive ice sheet models.
  - Estimating sea-ice thickness to examine ice/ocean/atmosphere exchanges of energy, mass and moisture.

Time-series animation based on Envisat Advanced Synthetic Aperture Radar (ASAR) data from 31 July, 4 August, and 7 August 2010 showing the breaking of the Petermann glacier and the movement of the new iceberg towards Nares Strait. Credits: ESA



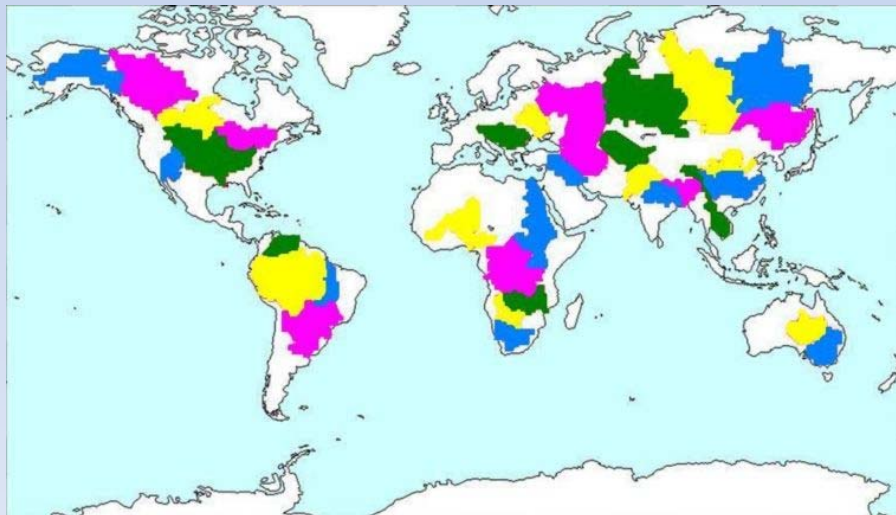
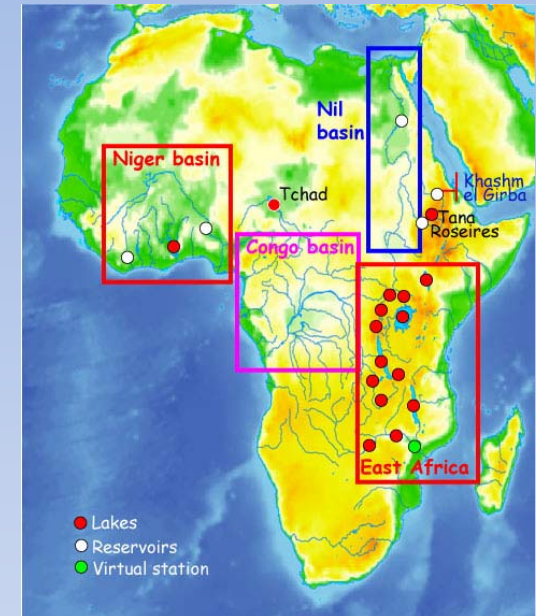
Schematic diagram of ICESat on a transect over the Arctic. ICESat uses a 1064 nm laser operating at 40 Hz to make measurements at 172-m intervals over ice, oceans, and land.



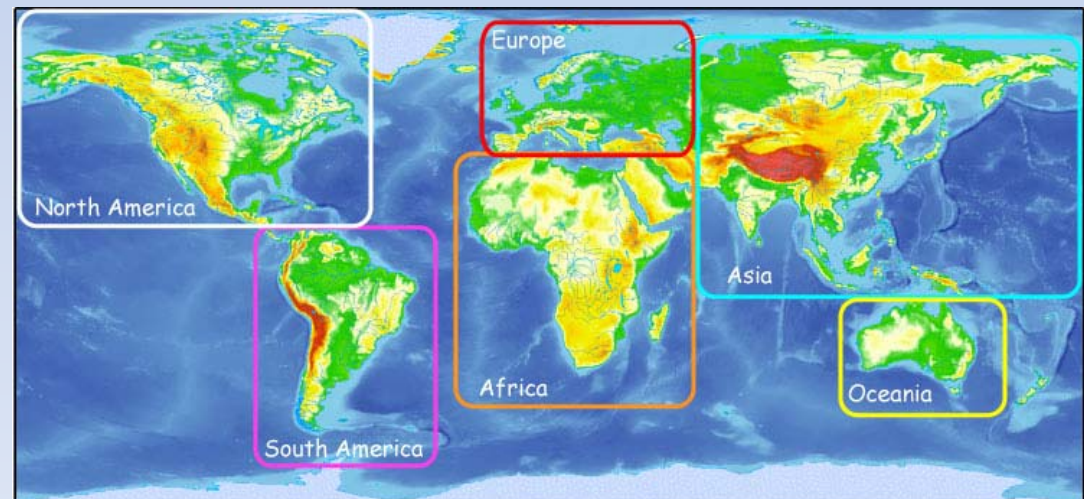


# Lake Level

- Lake level is a complex index of natural water exchange within their watersheds. Therefore, long-term level fluctuations in natural (unregulated) lakes also reflect climate changes occurring in the region.
- Hydroweb provides lake level variations in time calculated from satellite radar altimetry.
- Lake Level data base contains time series over water levels of large rivers, lakes and wetlands around the world. These time series are mainly based on altimetry data from Topex/Poseidon for rivers, but ERS-1 & 2, Envisat, Jason-1 and GFO data are also used for lakes.



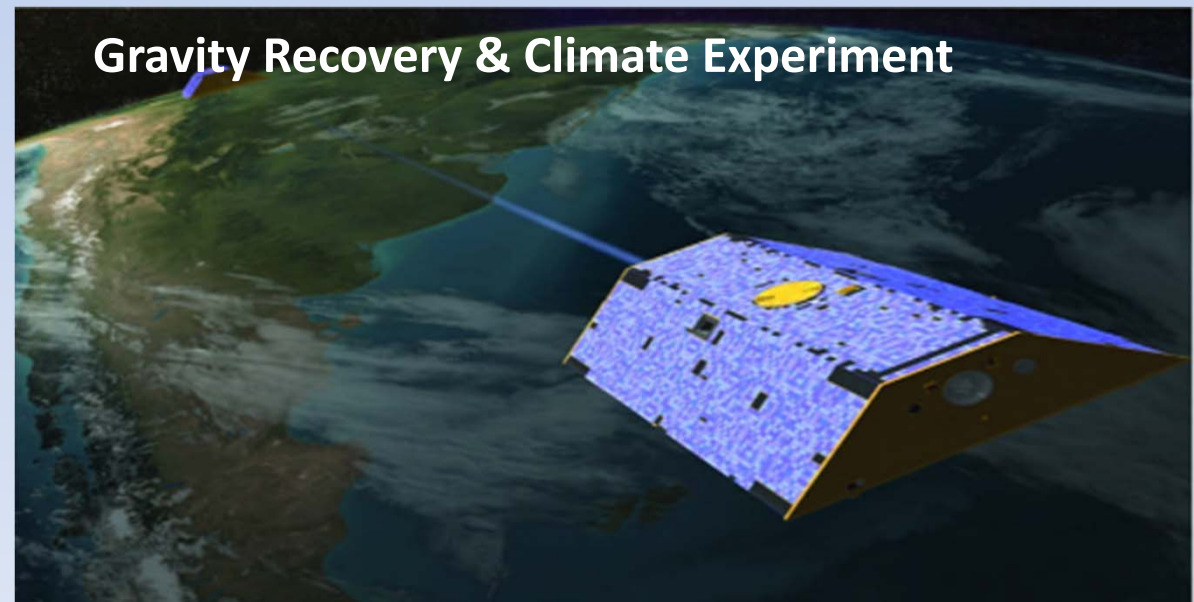
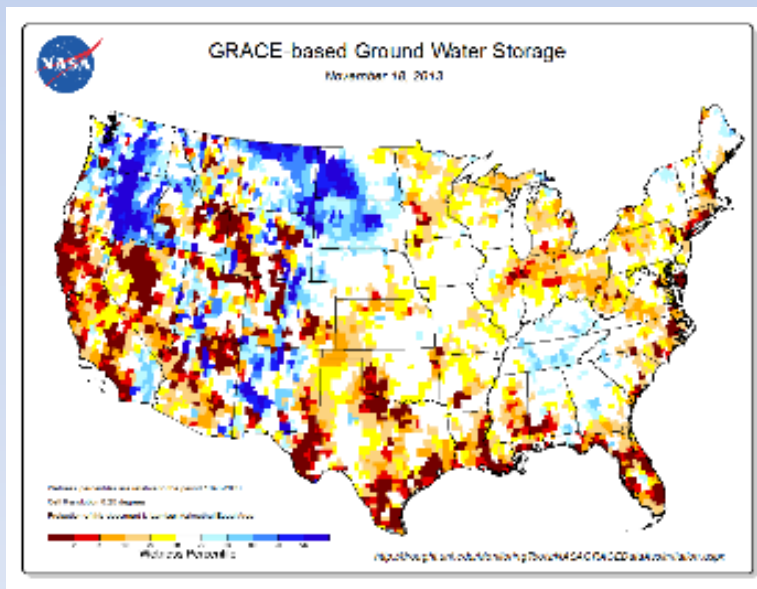
Continental water storage from gravimetry



Hydrology by altimetry (Surface monitoring by satellite altimetry)

# Groundwater

- The feasibility of satellite observation of groundwater storage variations using the Gravity Recovery and Climate Experiment (GRACE) mission has been demonstrated by measuring subtle temporal variations in gravity.



# Data: Land Surface Observations and Satellites

<u>Precipitation:</u>	SSM/I, TRMM, AMSR-E, GOES, AVHRR, GPM
<u>Radiation:</u>	MODIS, GOES, AVHRR, <b>CLARREO</b>
<u>Surface Temperature:</u>	AVHRR, MODIS, SSM/I, GOES
<u>Soil Moisture:</u>	ERS-1,2, RADARSAT, SSM/I, AMSR-E, SMOS, SMAP
<u>Groundwater:</u>	GRACE
<u>Snow Cover, Depth &amp; Water:</u>	AVHRR, MODIS, SSM/I, AMSR, GOES, <b>ICESat-2, DESDynI</b>
<u>Streamflow:</u>	Laser/Radar Altimeter
<u>Vegetation:</u>	AVHRR, Landsat TM, MODIS, GOES

Each of these satellites/sensors operates in multiple frequencies, that are used to derive one or more hydrological parameters.



# Weather and Climate Data

## Gaps in the weather map

The location of the world's key weather stations shows huge areas where information is not gathered



SOURCE: WORLD METEOROLOGICAL ORGANISATION

### Issues:

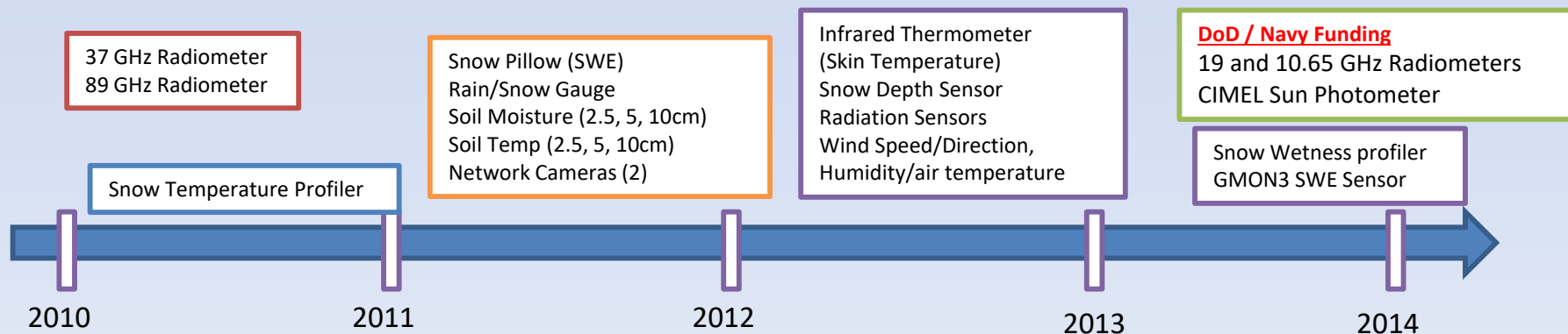
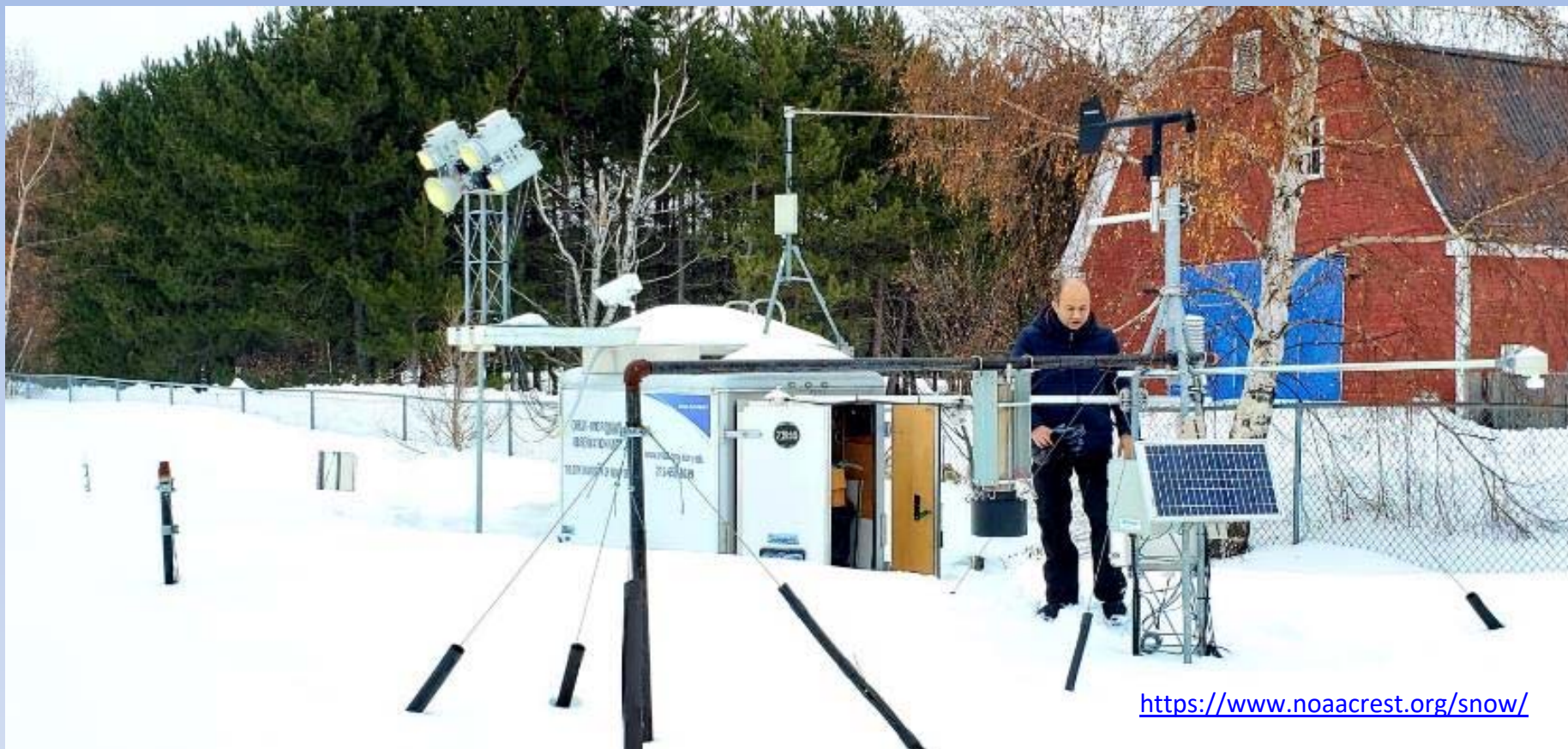
- Delay in processing the climate data (>1-3 years)
- Spatial and temporal gaps
- Limited measurements of variables (precipitation, temperature, wind speed, river runoff)



**My research**

# CREST-SAFE - Snow Analysis and Field Experiment

This Field campaign setup near National Weather Service at Caribou, ME in 2010 to support NASA/NOAA's Snow Algorithms.









# CREST-SAFE - Snow Analysis and Field Experiment





# CREST-SAFE - Snow Analysis and Field Experiment

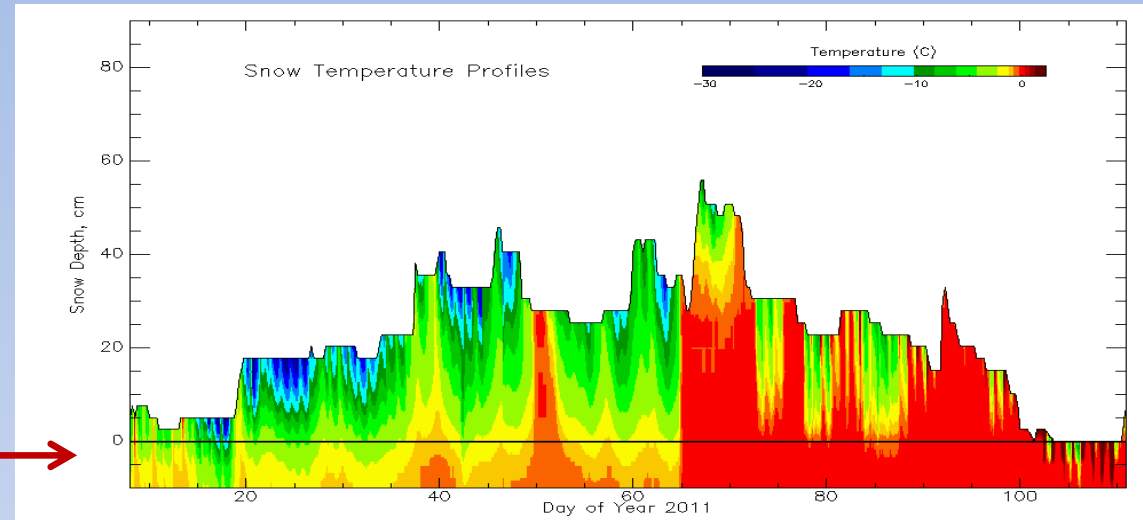
Snow Wetness Profiler



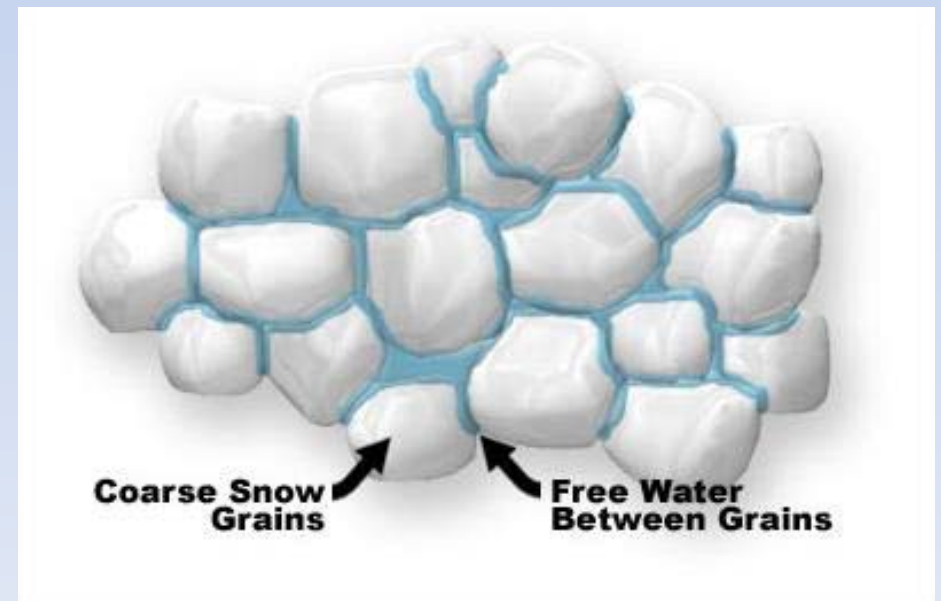
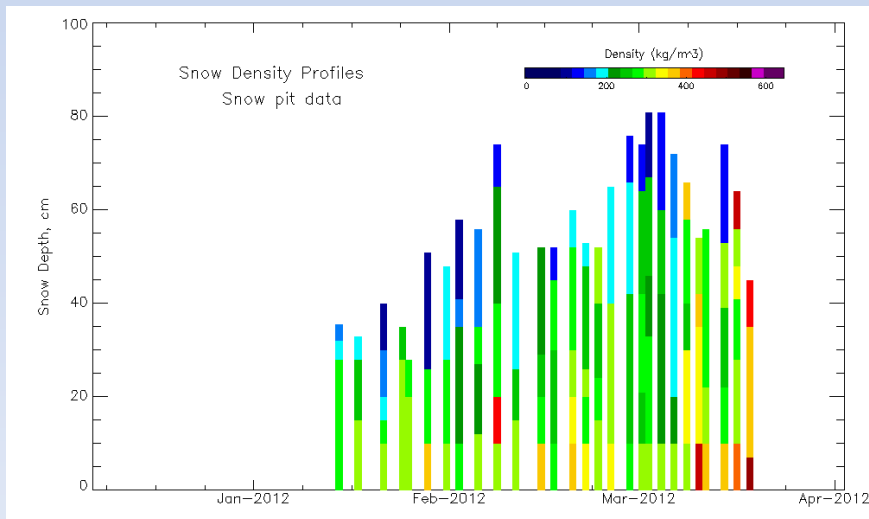
Snow Temp Profiler



Snow temperature profiler time series



Manual Measurements:





# Study and monitor snow: Why?

- Snow is an important factor for Transportation, Hydro-power generation, Agriculture, Wildlife, Recreation.

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**California Snowpack Melts With Br  
Drought Continues in Most of the U.S.**

By Tom Iuliano | April 18, 2014 11:58 am

f t e + 76



Much of the Western United States is visible in this picture taken from the International Space Station. (Source: NASA)

Severe drought continues in a large portion of the latest U.S. Drought Monitor report, issued yesterday.



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## List of avalanches

From Wikipedia, the free encyclopedia

This is an incomplete list of notable avalanches.

Death toll (estimate)	Event	Location	Date
13	<a href="#">2014 Mount Everest avalanche</a>	<a href="#">Nepal</a>	April 2014
5	<a href="#">Sheep Creek (Loveland Pass) avalanche</a> <sup>[12]</sup>	<a href="#">United States</a>	2013
201 (56 confirmed, 145 presumed dead)	<a href="#">2012 Afghanistan avalanches</a> <sup>[2]</sup>	<a href="#">Afghanistan</a>	2012
138	<a href="#">2012 Siachen Glacier avalanche</a>	<a href="#">Pakistan</a>	2012
11	<a href="#">Manaslu</a> <sup>[10]</sup>	<a href="#">Nepal</a>	2012
9	<a href="#">Mont Maudit avalanche</a> <sup>[11]</sup>	<a href="#">France</a>	2012
9	<a href="#">Restelica</a>	<a href="#">Kosovo</a>	2012
3	<a href="#">2012 Tunnel Creek avalanche</a>	<a href="#">United States</a>	2012
172	<a href="#">2010 Salang avalanches</a> ; series of at least 36 avalanches	<a href="#">Afghanistan</a>	2010
102	<a href="#">2010 Kohistan avalanche</a>	<a href="#">Pakistan</a>	2010
11	<a href="#">2009 Zigana avalanche</a>	<a href="#">Turkey</a>	2009
10	<a href="#">2009 Afghan avalanches</a>	<a href="#">Afghanistan</a>	2009
6	<a href="#">2009 Schalkkogel avalanche</a>	<a href="#">Austria</a>	2009
3	<a href="#">2009 Buachaille Etive Mòr avalanche</a>	<a href="#">United Kingdom</a>	2009
11	<a href="#">Flathead Valley avalanches</a>	<a href="#">Canada</a>	2008
7	<a href="#">Western Tatras</a>	<a href="#">Slovakia</a>	2005
7	<a href="#">2003 Connaught Creek Valley avalanche</a>	<a href="#">British Columbia</a>	2003
125	<a href="#">Kolka-Karmadon rock ice slide</a>	<a href="#">Russia</a>	2002
9	<a href="#">Cerro ventana avalanche</a>	<a href="#">Argentina</a>	2002
31	<a href="#">Galtür Avalanche</a>	<a href="#">Austria</a>	1999
12	<a href="#">Montroc avalanche</a> <sup>[8]</sup>	<a href="#">France</a>	1999
3	<a href="#">1996 Mount Everest disaster</a> <sup>[14]</sup>	<a href="#">Nepal</a>	1996
20	<a href="#">Flateyrri</a>	<a href="#">Iceland</a>	1995

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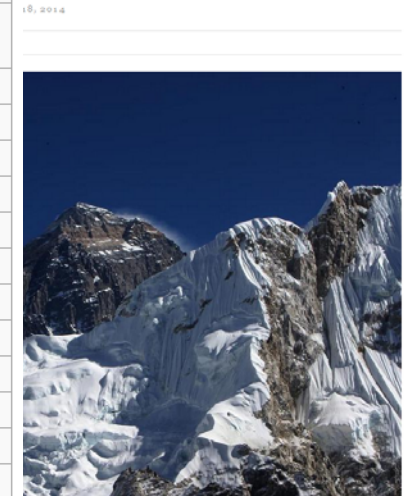
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## Avanche 'kills 22' in



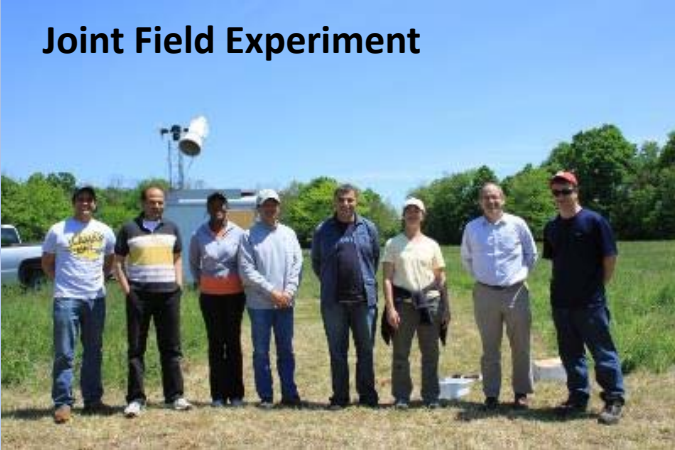
Getting emergency supplies through to avalanche-hit areas is always a challenge

## er Mount Everest avalanche



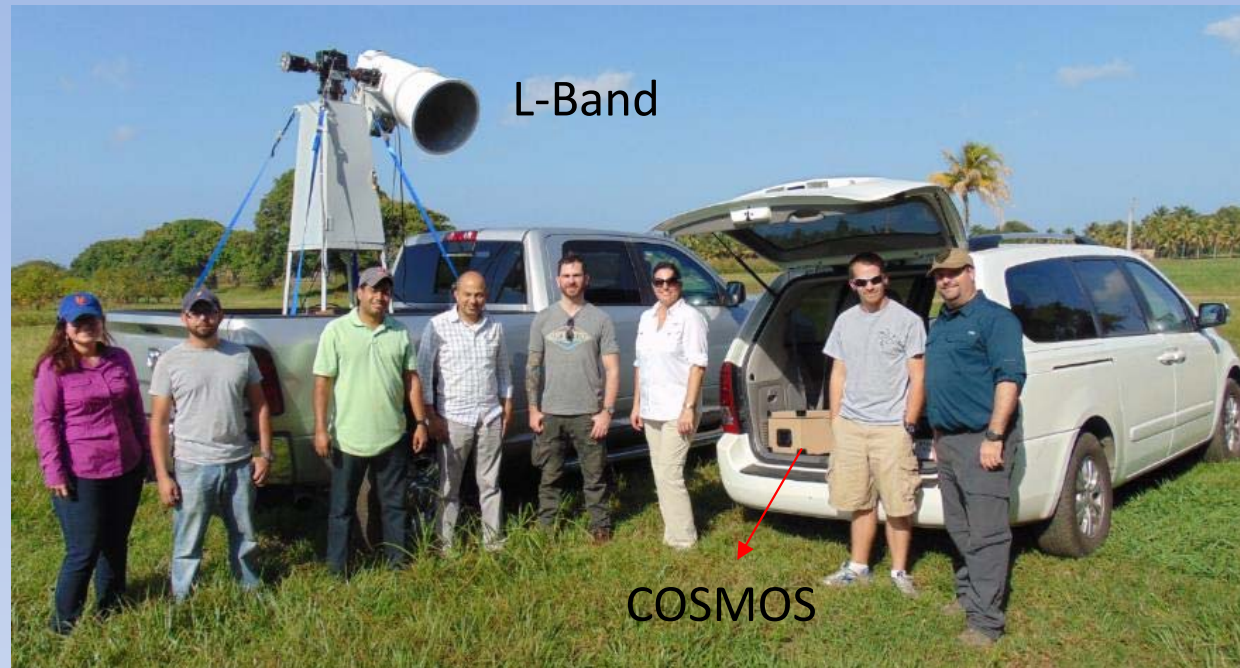


# CREST-SMART - Soil Moisture Advanced Radiometric Testbed

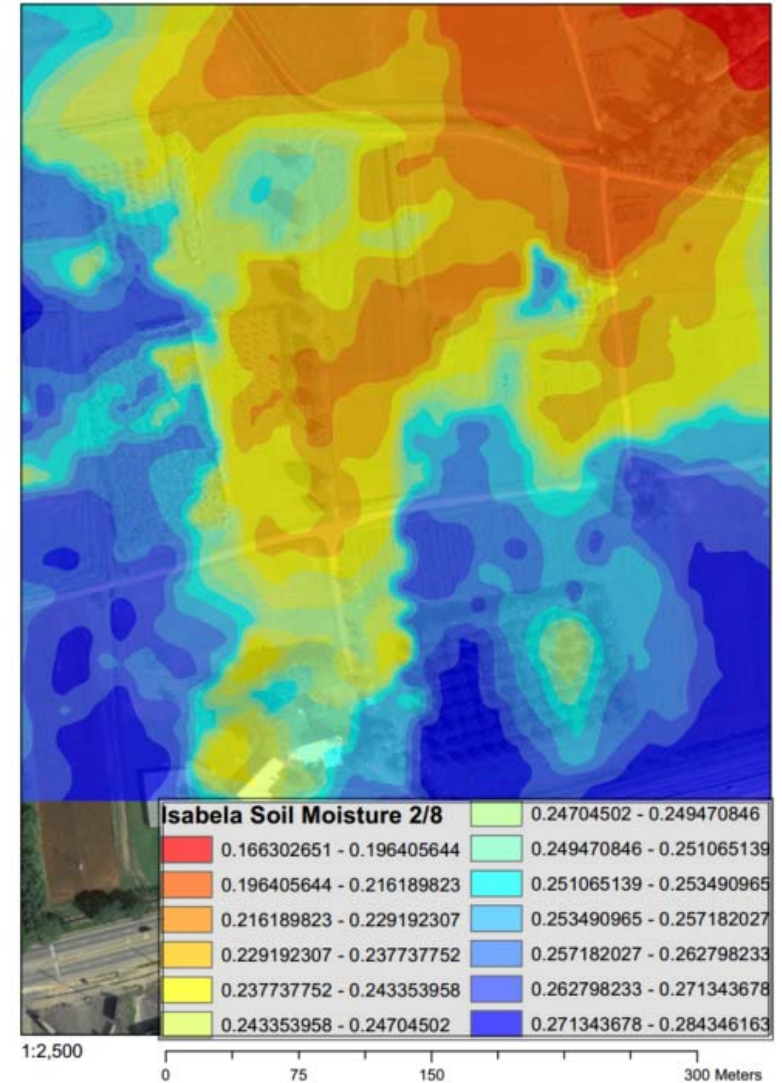




# CREST-SMART - Soil Moisture Advanced Radiometric Testbed



Collaborative Field campaign with ERDC/GRL- US Army

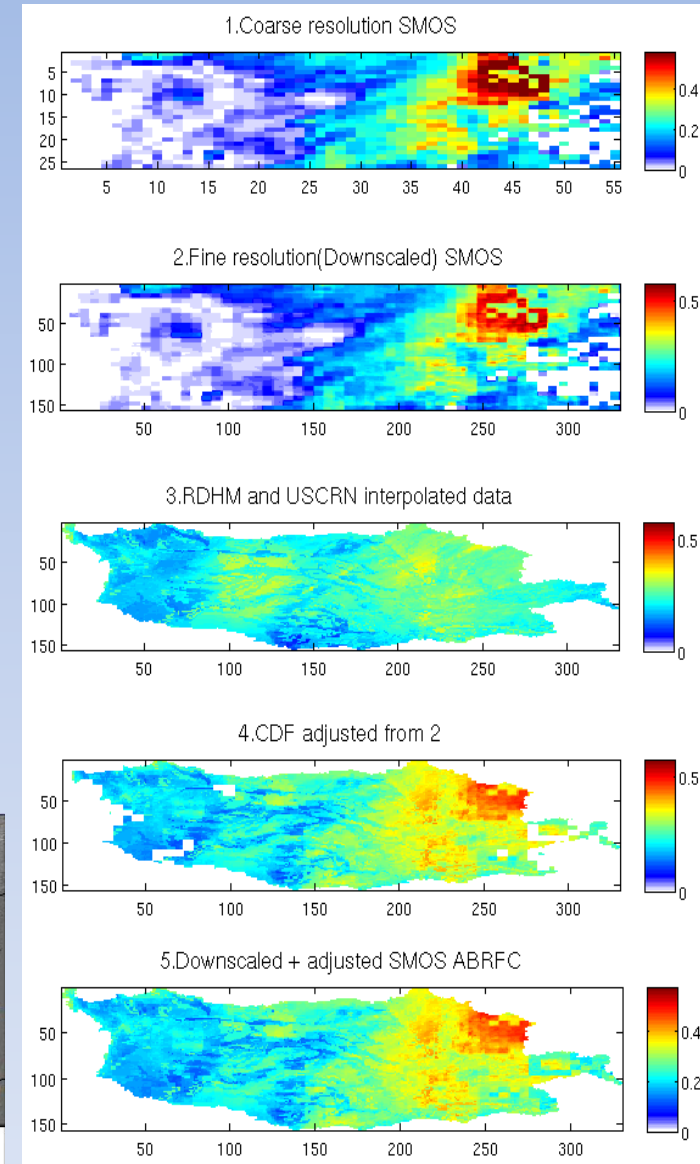
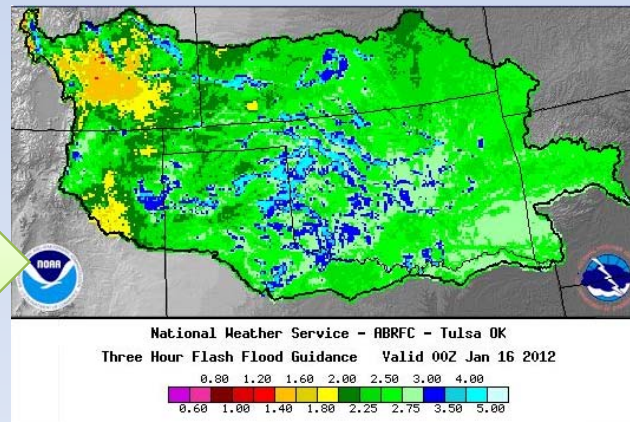


High Resolution Soil Moisture Map @ Isabela  
Collaborative work with ERDC/GRL- US Army



# Satellite Based Soil Moisture for Gridded Flash Flood Guidance

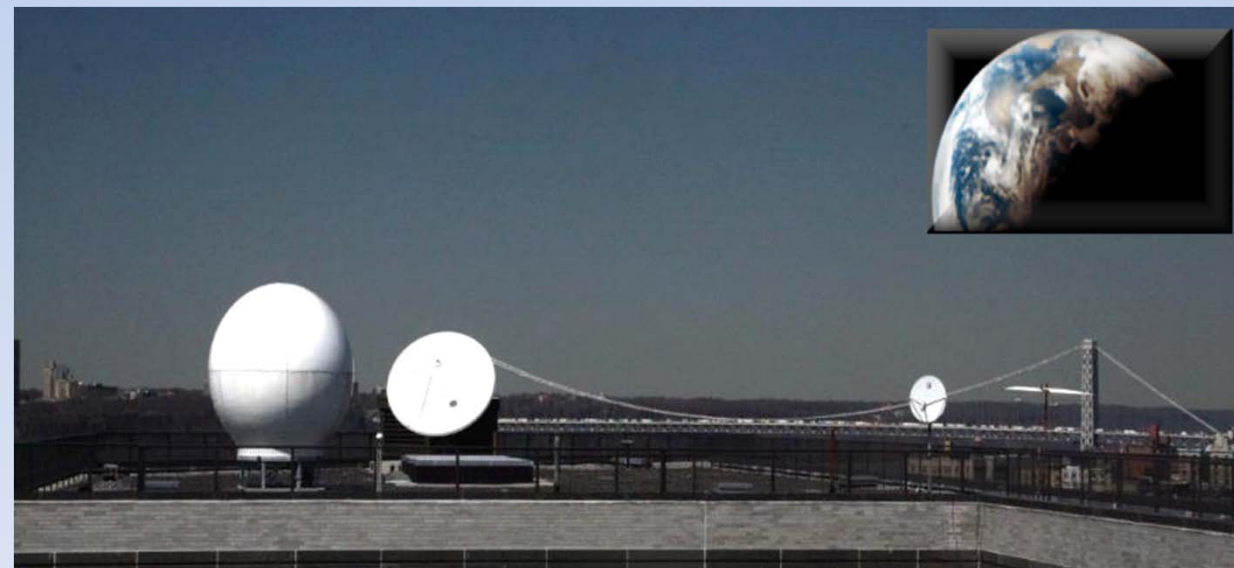
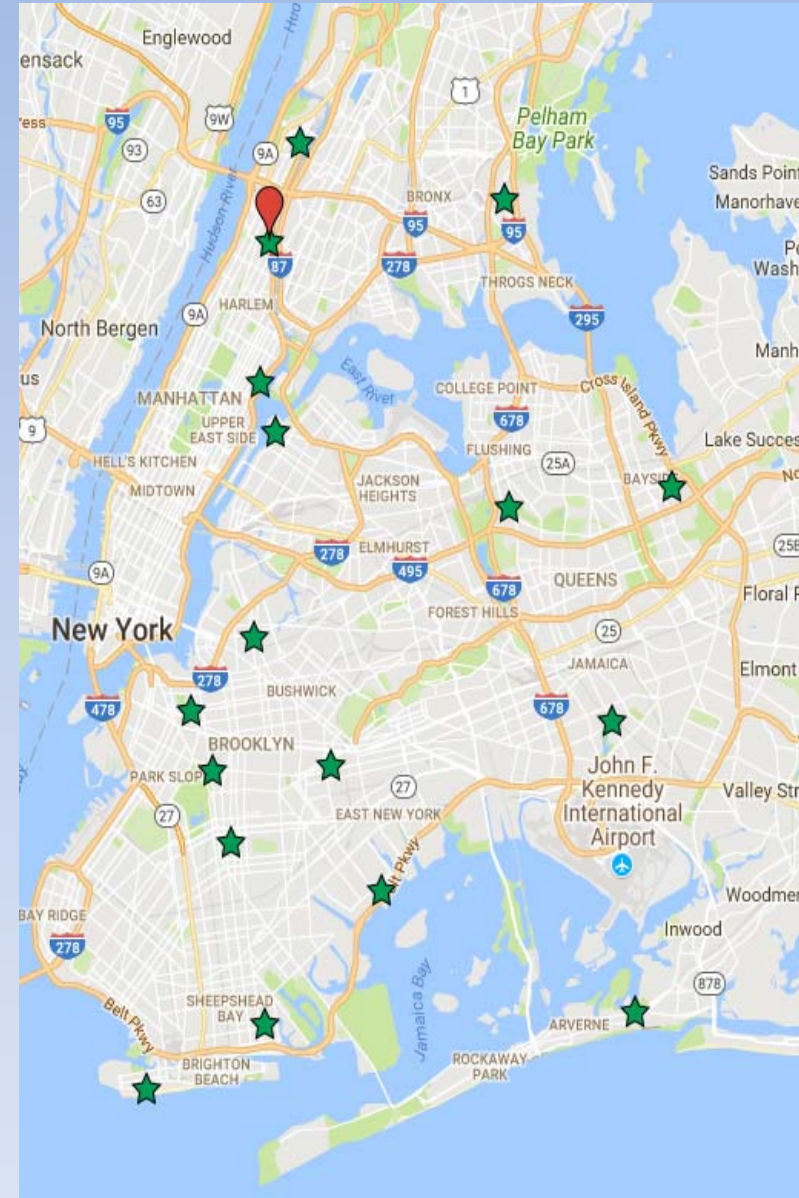
- The motivation of this project to **integrate remote sensing satellite based soil moisture data** in current hydrological modeling to improve NWS Gridded Flash Flood Guidance System.
- The data from Soil Moisture and Ocean Salinity (SMOS) mission is being used as a proxy to NASA's SMAP mission's soil moisture data.
- A methodology is being developed to employ the direct soil moisture data from SMOS to replace the model-calculated soil moisture state which is based on the soil water balance.
- **End Users:** River Forecasting Centers, Water Resources Managers and Public Safety Managers.
- **People involved:**  
Tarendra Lakhankar, Reza Khanbilvardi, Dugwon Seo (PhD student), Juan Mejia (MS student), Brian Cosgrove, Victor Koren, Mike Smith (NOAA/NWS/OHD), Xiwu Zhan, (NESDIS/STAR)



Soil moisture from SMOS to  
Basin scale assimilation



# New York – Urban Hydromet Testbed



The Satellite Receiving Station

<http://www.noaacrest.org/uHMT/>



# Questions?

