

# Atmospheric Correction of Sentinel 2A Data and Influence on Winter Wheat Phenology in Kabul Region, Afghanistan

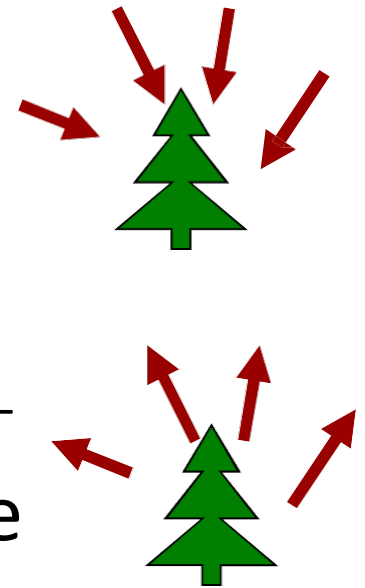
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NASA MSFC

# Atmospheric Correction of Sentinel-2a Data

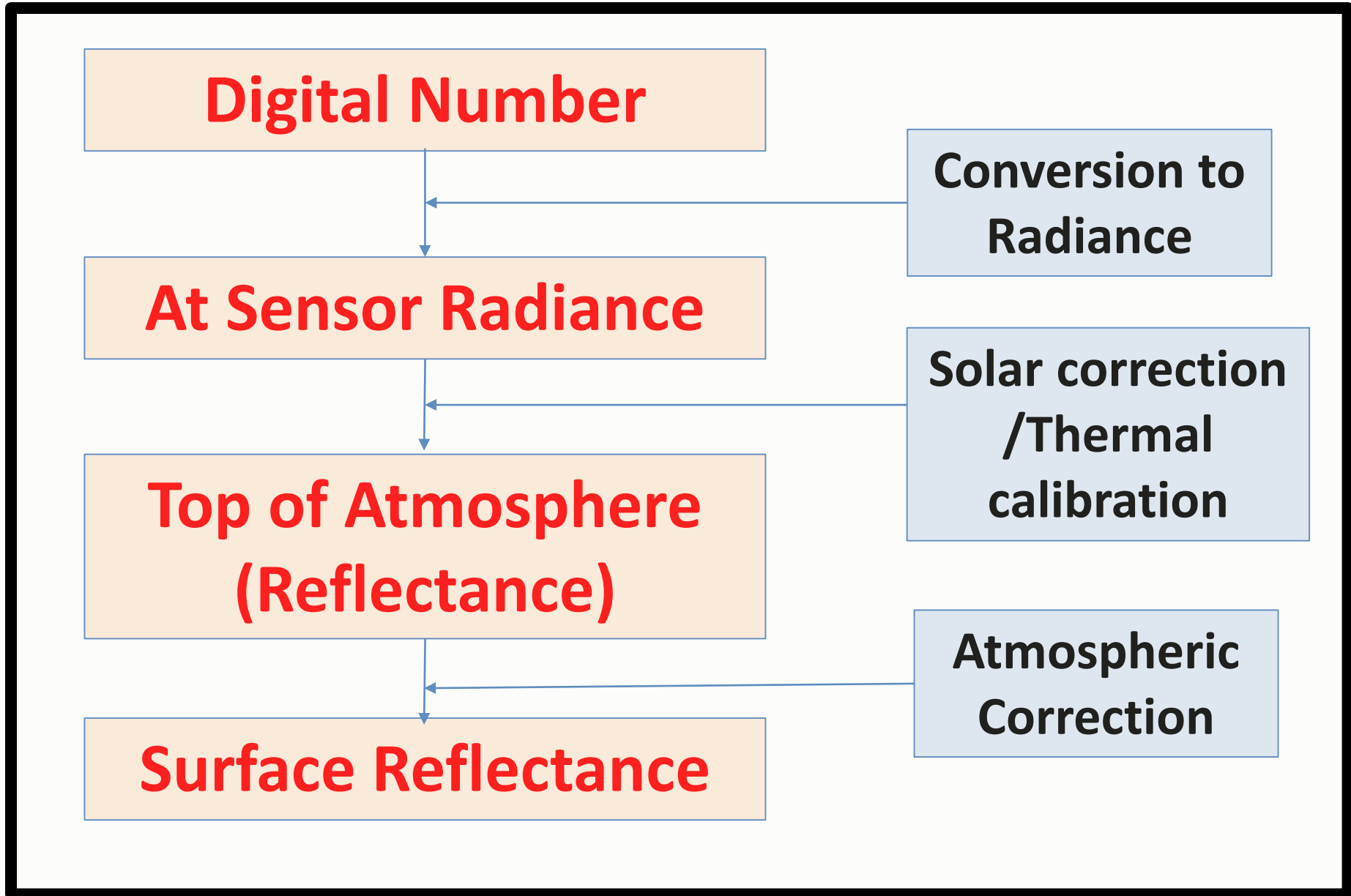
- Is Atmospheric correction needed?
- How much is the improvement in scene quality before and after atmospheric correction (specific to Kabul region in Afghanistan for NDVI)?
- Is the improvement consistent across all months?

# Units of Electromagnetic Radiation

- **Irradiance** - radiant flux *incident* on a receiving surface from all directions, Energy per unit surface area,  $\text{W m}^{-2}$
- **Radiance** - radiant flux *emitted* or scattered by a unit area of surface as measured through a solid angle,  $\text{W m}^{-2} \text{sr}^{-1} \mu\text{m}^{-1}$  (energy (Watt) per unit area (square meter) per solid angle per unit wavelength ( $\mu\text{m}^{-1}$ ))
- **Reflectance** - fraction of the incident flux that is reflected by a medium



# Basic Pre-processing



- **DN to Radiance Conversion**

- $L = [(LMAX - LMIN)/255] \times DN + LMIN$

- Where LMAX = radiance at which channel saturates  
LMIN = minimum recordable radiance

# At-Satellite Reflectance

To further correct for scene-to-scene differences in solar illumination, it is useful to convert to at-satellite reflectance. The term “at-satellite” refers to the fact that this conversion does not account for atmospheric influences.

$$\text{At-Satellite Reflectance, } \rho_{\lambda} = (\pi L_{\lambda} d^2) / (ESUN_{\lambda} \cos\theta)$$

Where

$L_{\lambda}$  = spectral radiance measured for the specific waveband

$\theta$  = solar zenith angle

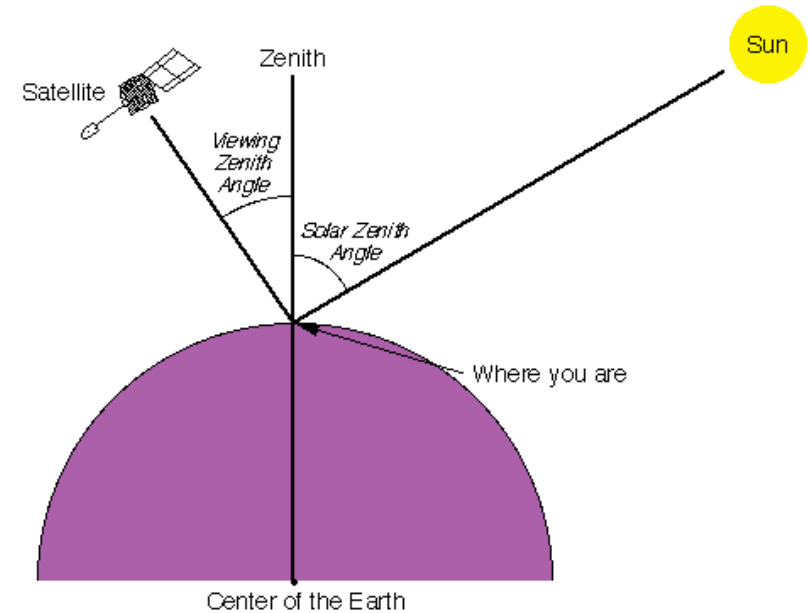
ESUN = mean solar exoatmospheric irradiance ( $\text{W m}^{-2} \mu\text{m}^{-1}$ ), specific to the particular wavelength interval for each waveband, consult the sensor documentation.

$d$  = Earth-sun distance in astronomical units, ranges from approx. 0.9832 to 1.0167, consult an astronomical handbook for the earth-sun distance for the imagery acquisition date

# Atmospheric Correction is Mandatory When Using Multi-Temporal Images

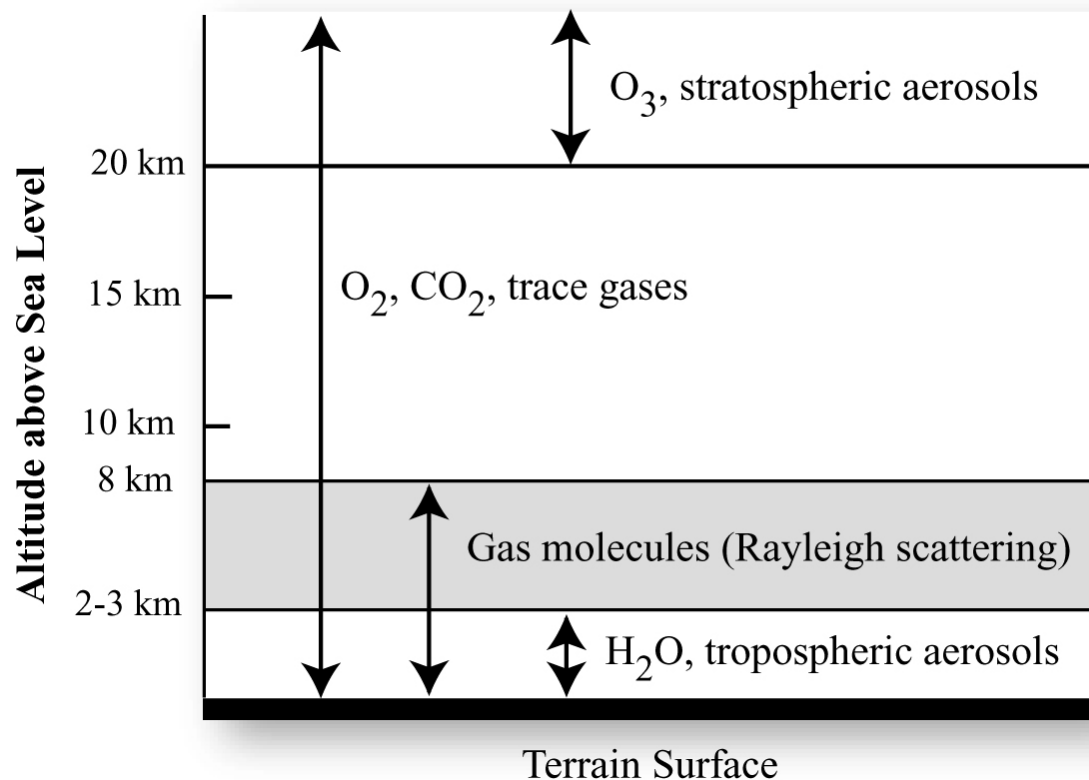
- Conversion from DN to reflectance can be affected by:
  - Illumination geometry
  - Sensor calibration
  - Atmospheric conditions
- Since Multi-temporal images are acquired
  - during different times (eg: 1<sup>st</sup> day of summer longest day of sunlight)
  - atmospheric conditions
  - solar illumination
  - sensor calibration
  - view angles

Atmospheric correction is required.



# Atmospheric Layers and Constituents

Major subdivisions of the atmosphere and the types of molecules and aerosols found in each layer.



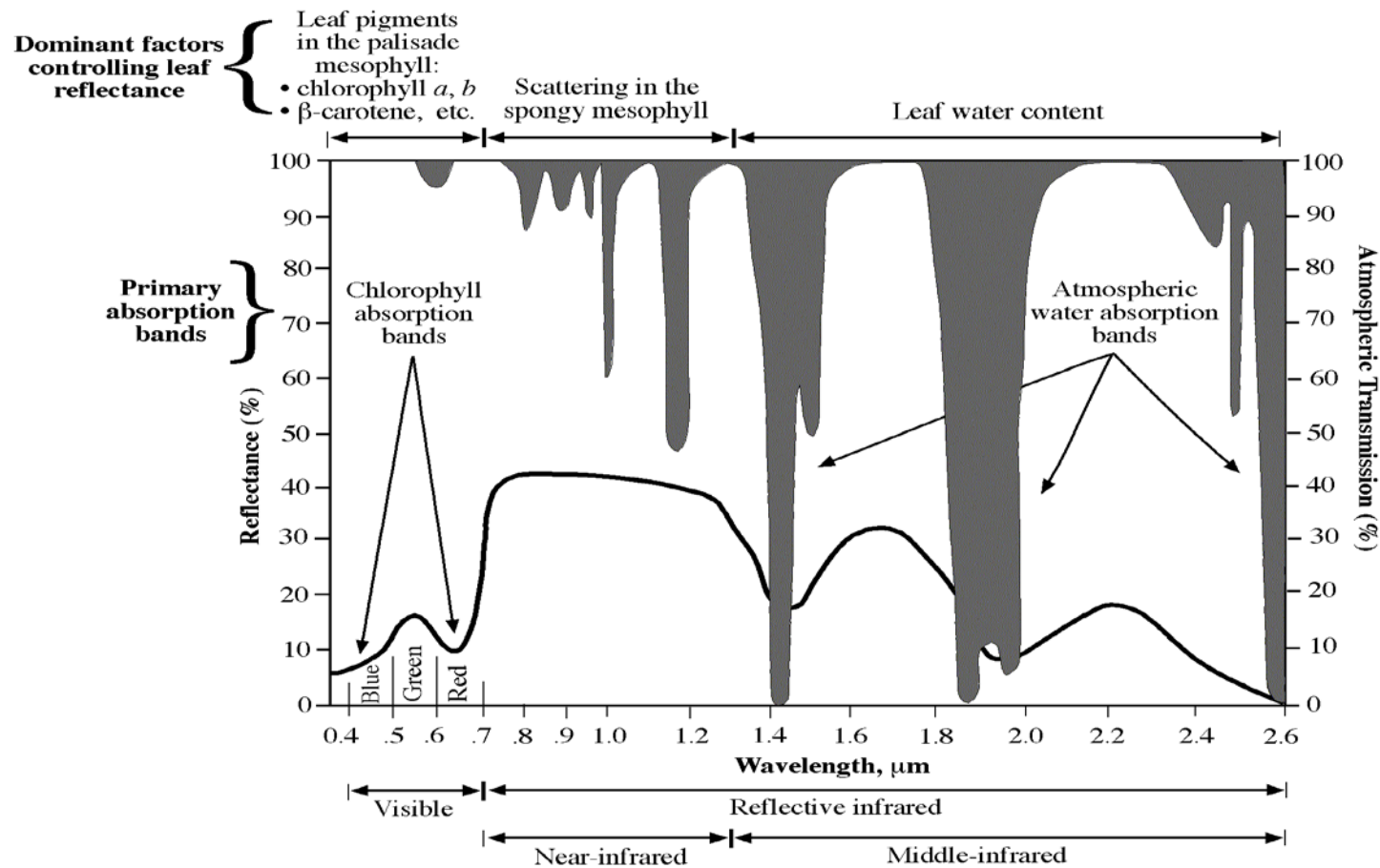
**Diameter of particles less than the wavelength of radiation**

**Diameter of particles larger than the wavelength of radiation**

*Both Rayleigh and Mie scattering causes Haze and decreases Contrast !*



# Atmospheric Windows



**Absorption** is dominant process in **visible**

**Scattering** is dominant process in **near infrared**

**Water absorption** is increasingly important with increasing wavelength in the infrared.

*Atmospheric correction algorithms should take into account absorption as well as scattering in different wavelengths.*

# Atmospheric Correction Methods

## Absolute

-Methods account for view angles, atmospheric conditions, aerosol types, water vapor, gaseous absorption, etc.

-Generally Absolute methods use some sort of radiative transfer code such as MODTRAN (MODerate resolution atmospheric TRANsmission code (developed by Air Force Research Lab) to model atmospheric propagation of electromagnetic radiation (eg: 6S, FLAASH or, ATCOR)

*-For Absolute methods, atmospheric properties as inputs are required!*

# Atmospheric Correction Methods

## Relative

- Relative methods all proceed under the assumption that the relationship between the TOA radiances recorded at two different times from regions of constant reflectance is spatially homogeneous and can be approximated by a linear function.
- The normalization process can then be reduced to a linear regression calculation for each spectral band.
  - Histogram matching
  - Image regression
- ***The main difficulty of relative normalization methods is determining the landscape features whose reflectance's are nearly constant over time.***
  - ***Invariant Targets – eg: Buildings – similar solar illumination conditions and phenological conditions***

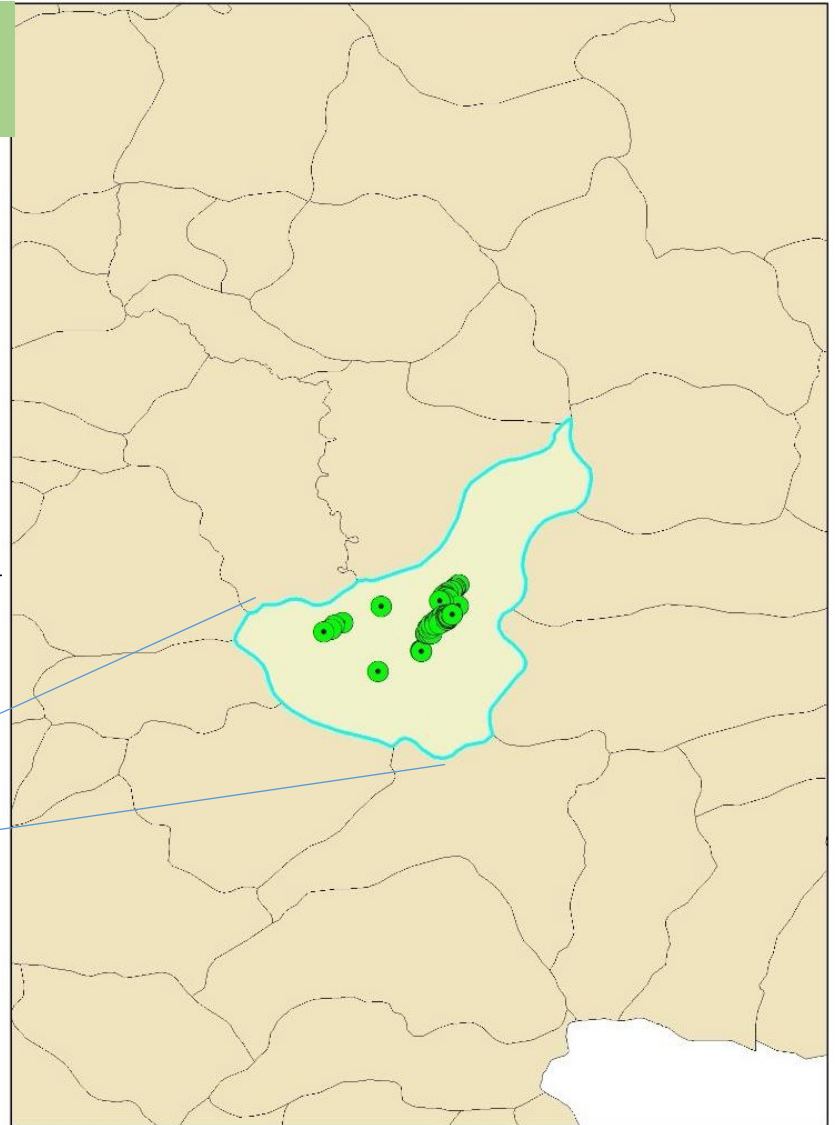
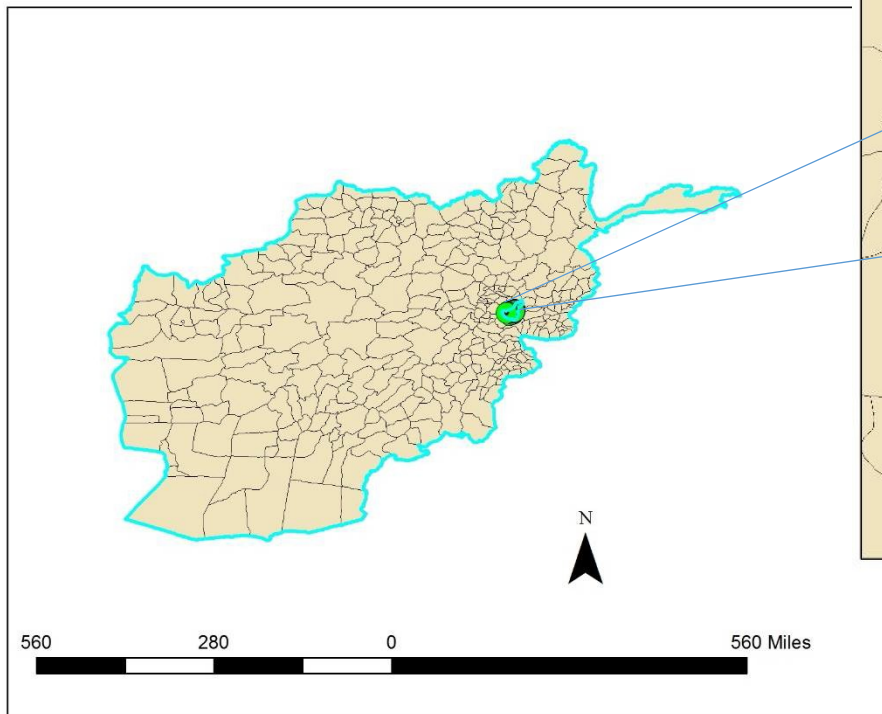
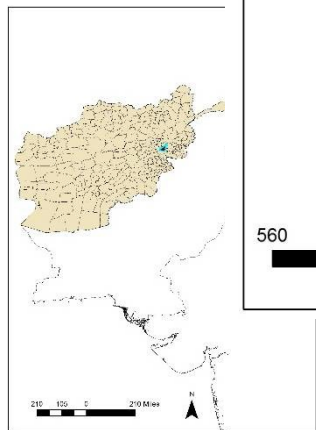
# Sen2Cor - Sentinel-2a Data

- Sentinel-2A was launched on June 23, 2015.
- The atmospheric correction software Sen2Cor was implemented by Telespazio France and DLR on behalf of ESA. TPZ-F and DLR have teamed up in order to provide the calibration and validation of the Level-2A processor Sen2Cor.
- Sen2Cor can be obtained downloading the S2 Toolbox (<http://step.esa.int/main/download>) and following plugins installation procedure

# Sen2Cor – Inputs/Outputs

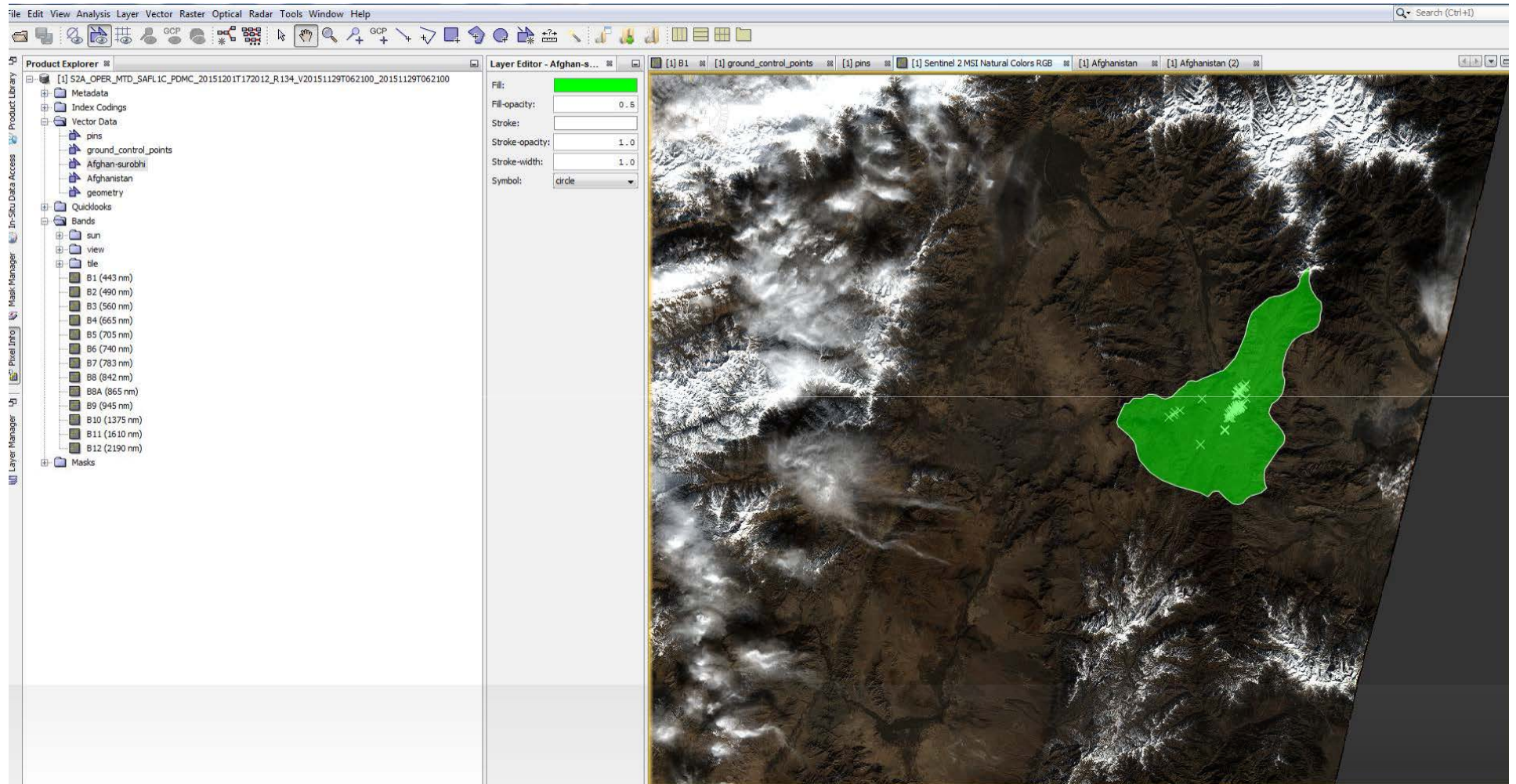
- Input: Level-1C ortho-image Top-Of-Atmosphere (TOA) reflectance products
- Output (60m, 20m, 10m)
  - Bottom-Of-Atmosphere (BOA) corrected reflectance
  - Aerosol Optical Thickness (AOT) map
  - Water Vapour (WV) map
  - Scene Classification (SC) map (cloud, dark areas, bare soil, vegetation, cloud probabilities, snow, etc.)
  - Quality Indicators for cloud and snow probabilities

# Afghanistan, Kabul



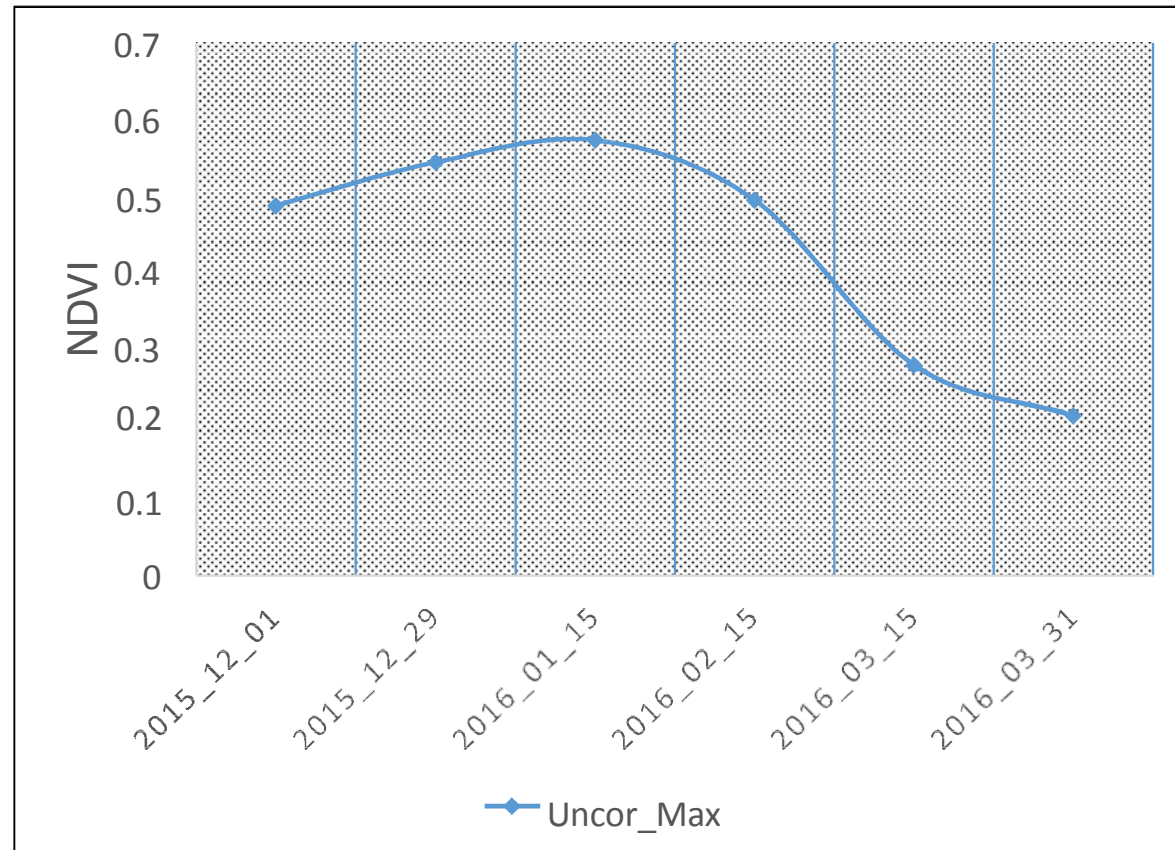


# Kabul Region Overlay over Sentinel-2a Data



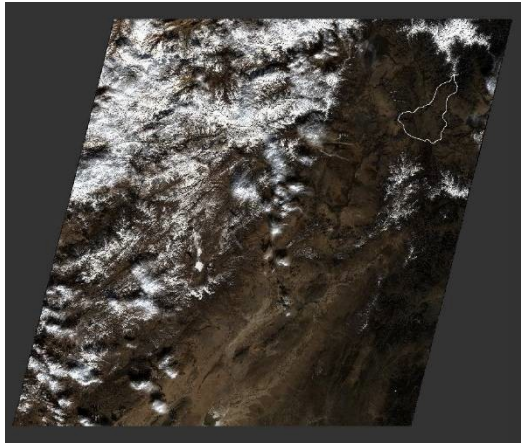
# Winter Wheat Phenology - Kabul

2015_Nov_29	1
2015_Dec_01	2
2015_Dec_29	3
2016_Jan_15	4
2016_Feb_15	5
2016_Mar_15	6
2016_Mar_31	7
2016_Apr_14	8
2016_Apr_27	9

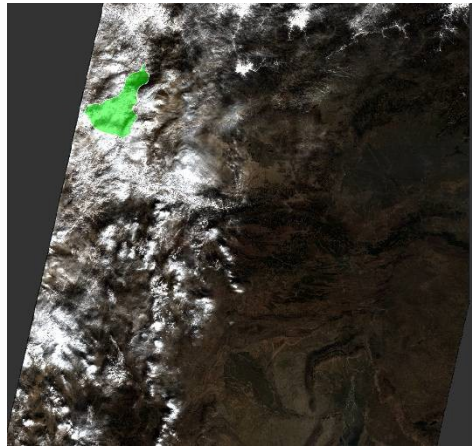


*Only part of the Wheat Growing Season images could be used due to too bad image quality !*

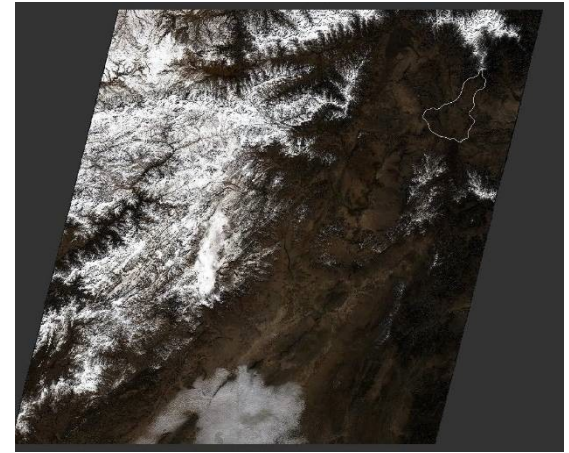




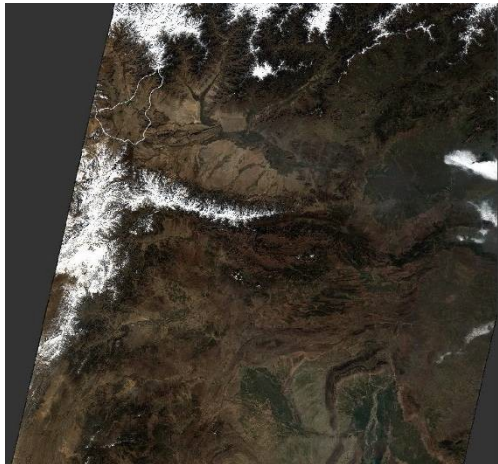
2015\_12\_01 - YES



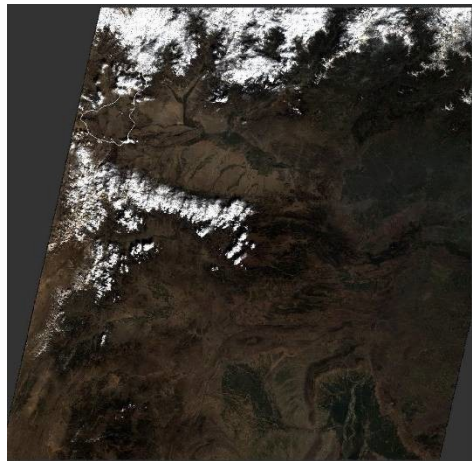
2015\_12\_16 - NO



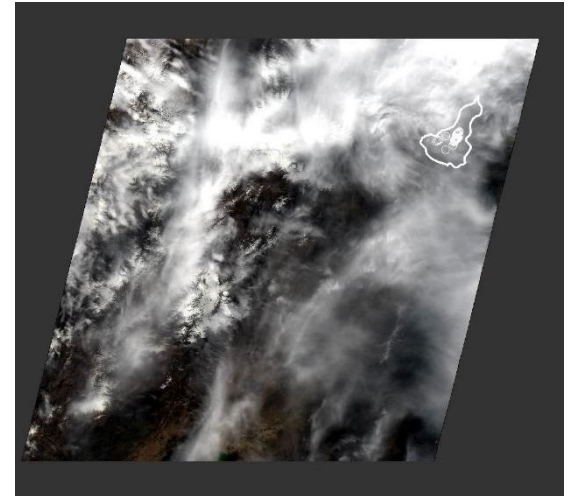
2015\_12\_29 - YES



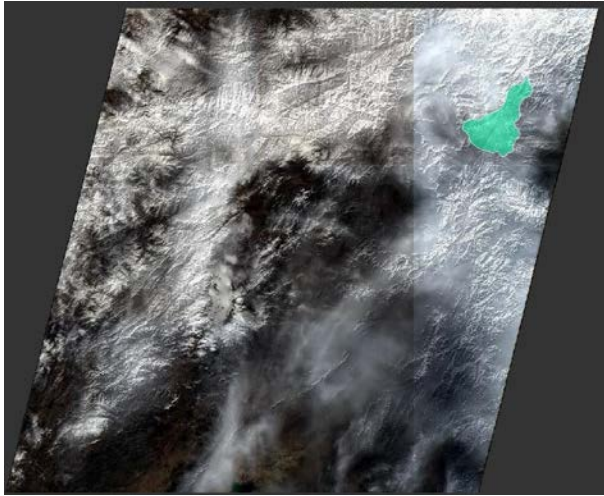
2016\_01\_15 - YES



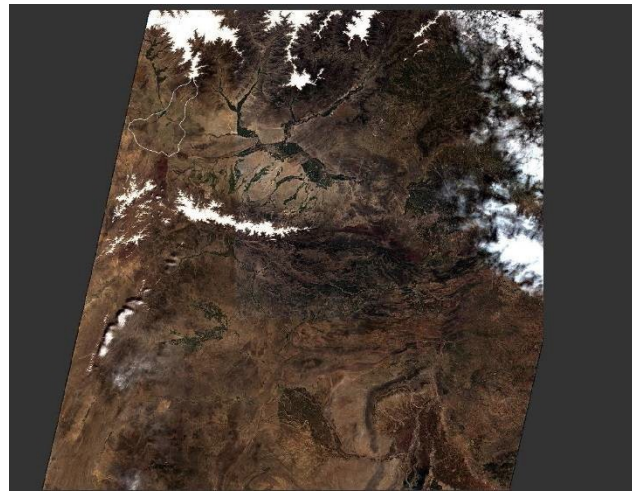
2016\_02\_15 - YES



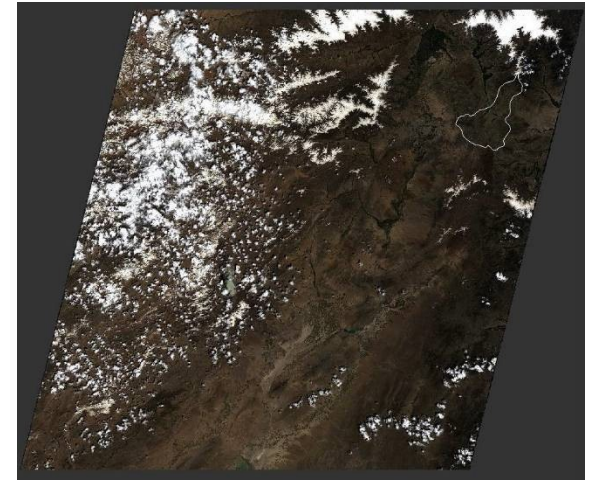
2016\_03\_28 - NO



2016\_03\_31 - YES



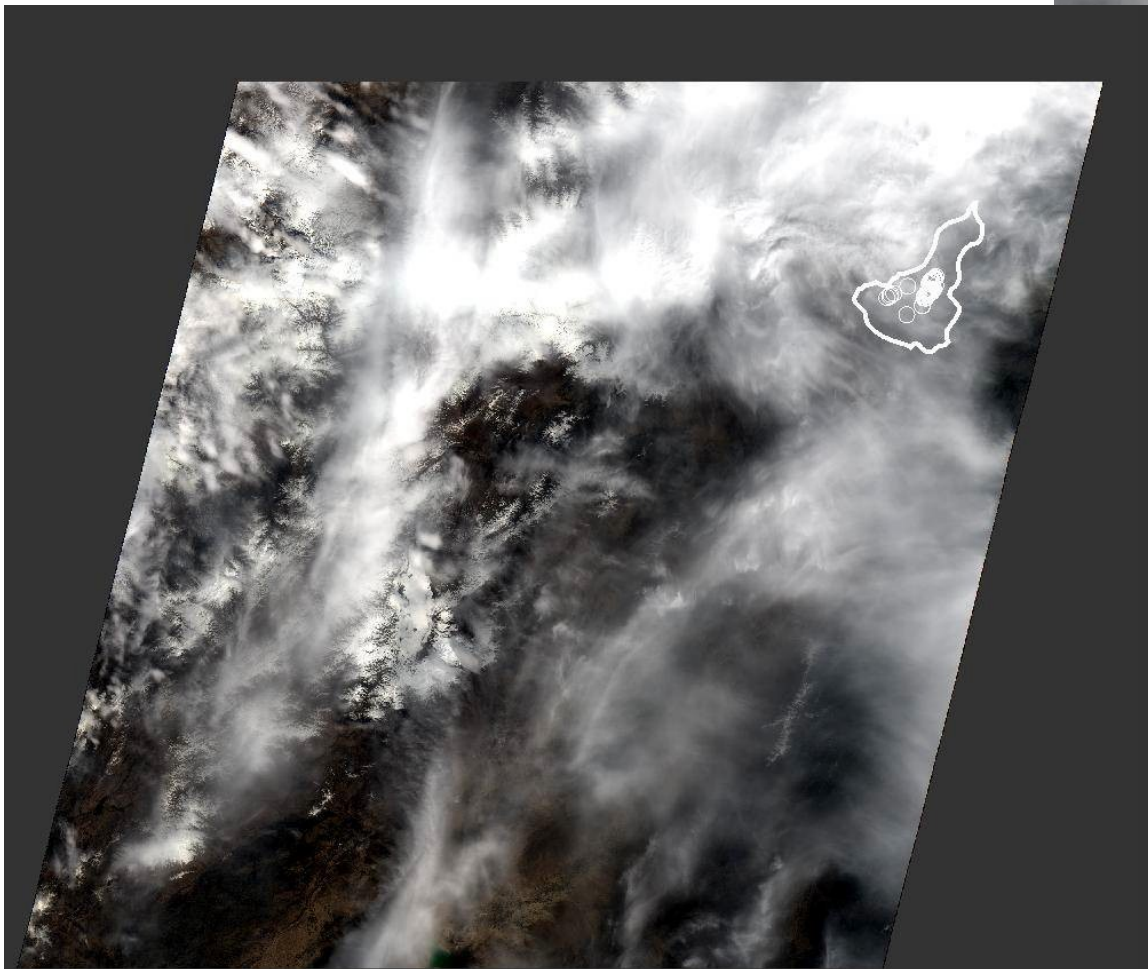
2016\_04\_14

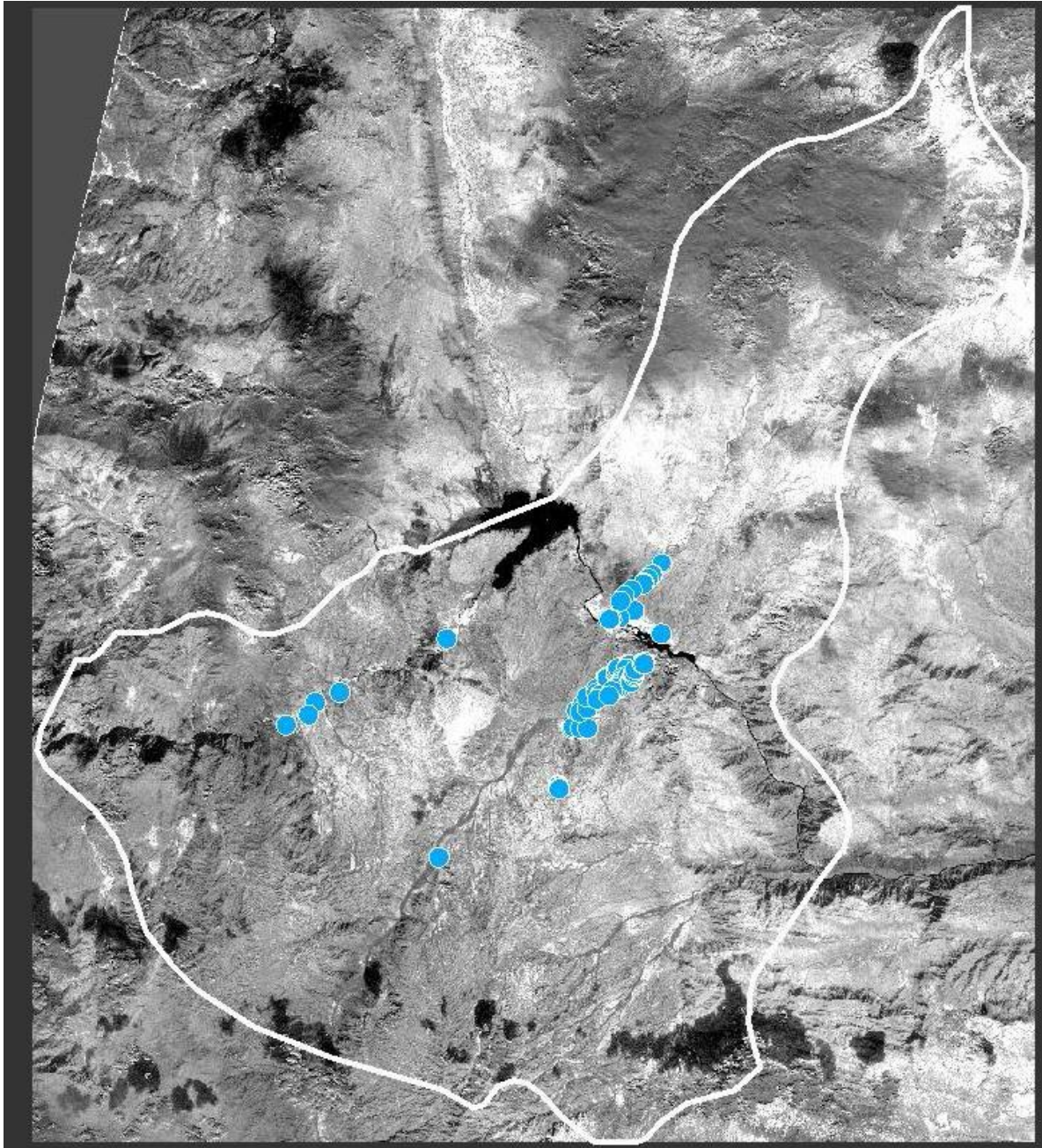


2016\_04\_27



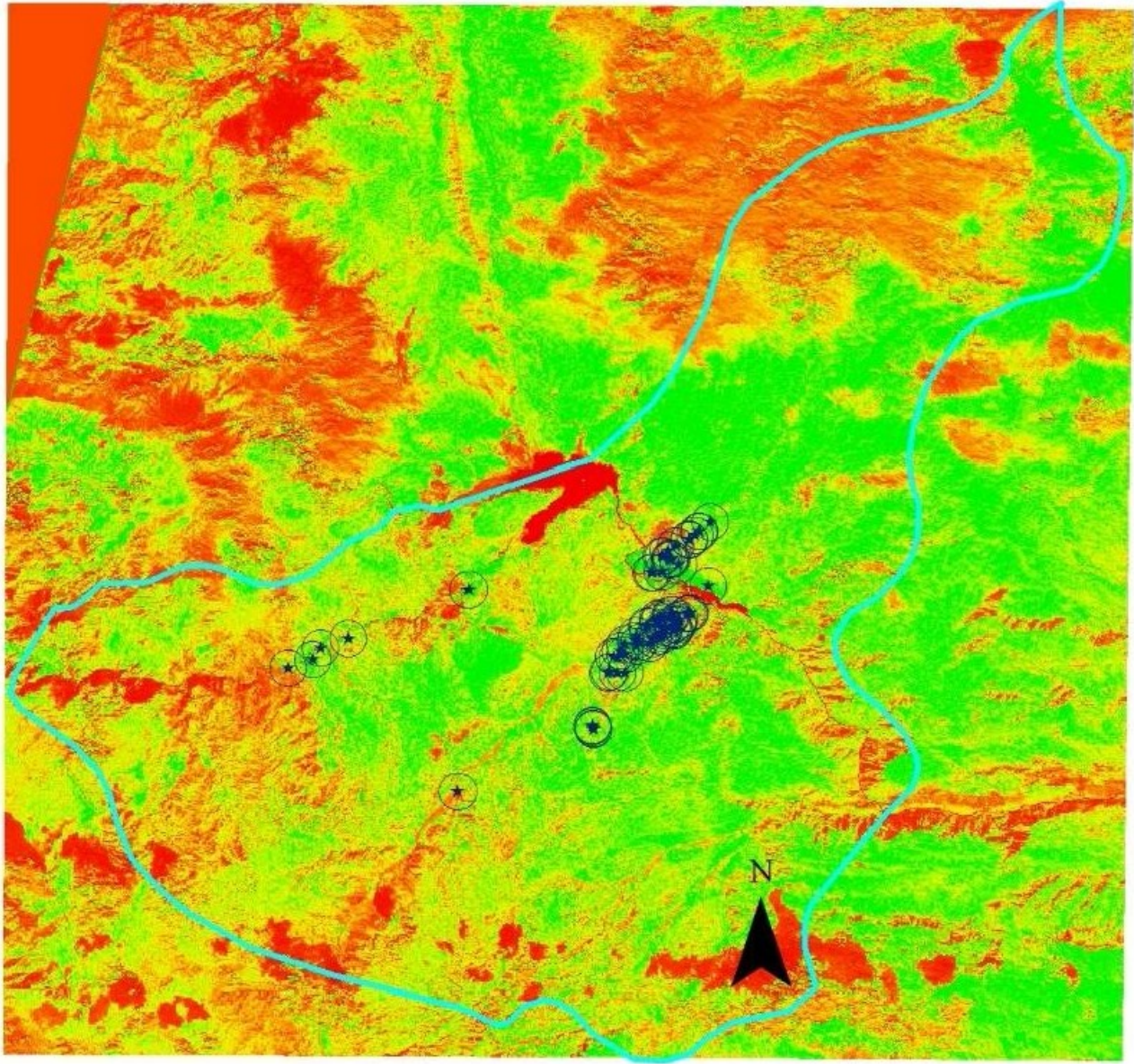
2016\_03\_31  
RGB!



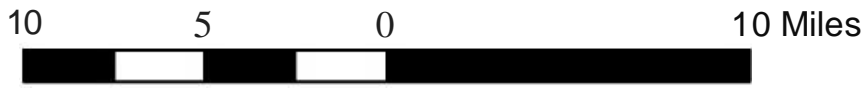


2015\_12\_29 - NDVI





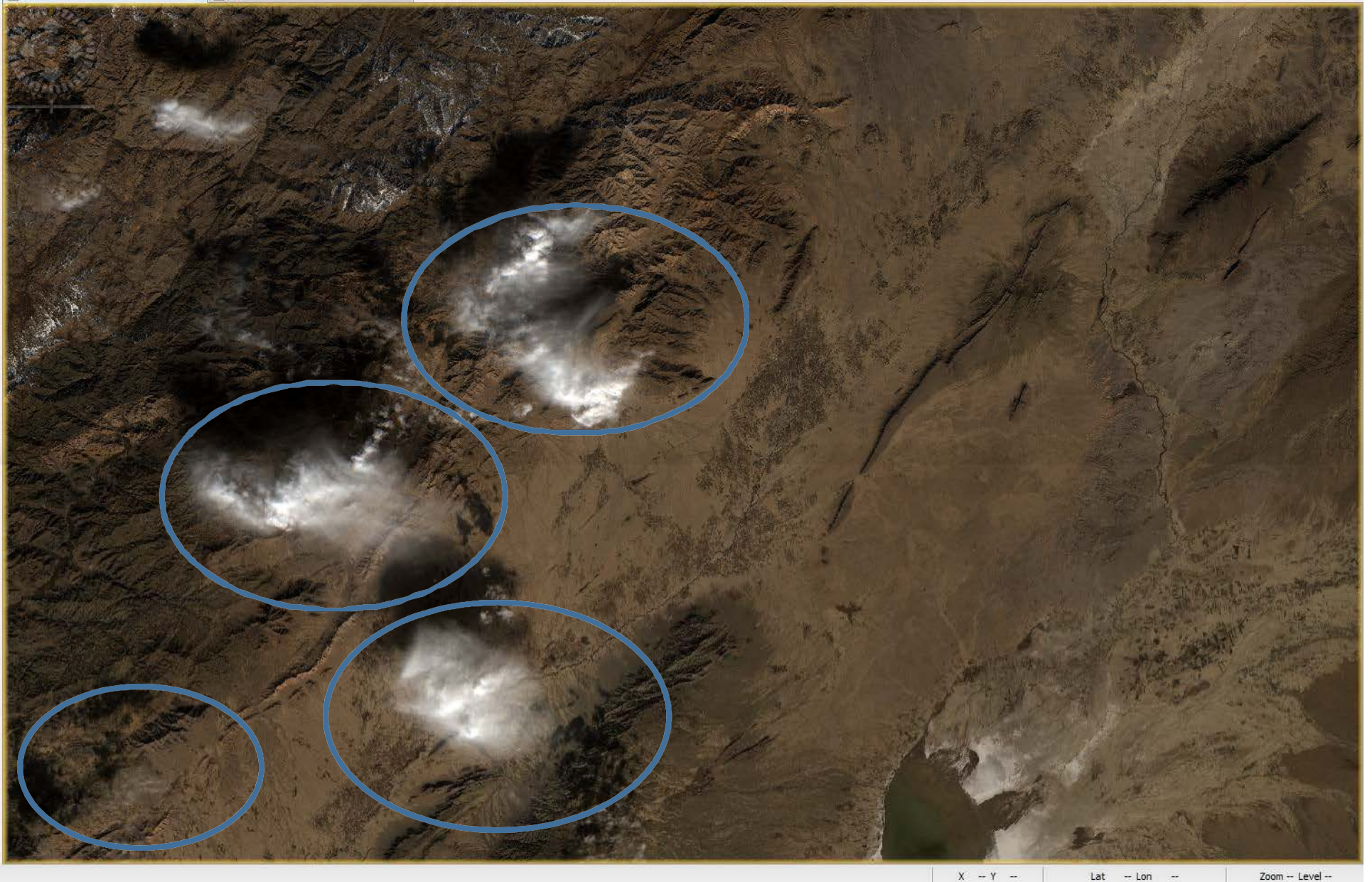
**NOVI**  
**Value**  
High : 1  
Low : 0



# Clouds - Before and After Correction



2015-12-01 – Sentinel2- L1C (RGB)





2015-12-01 – Sentinel2- L2C (RGB)





Haze-

Before and After Correction

# Haze before correction; 2015-12-01 – Sentinel2- L1A (B1)



X -- Y --

Lat -- Lon --

Zoom -- Level --

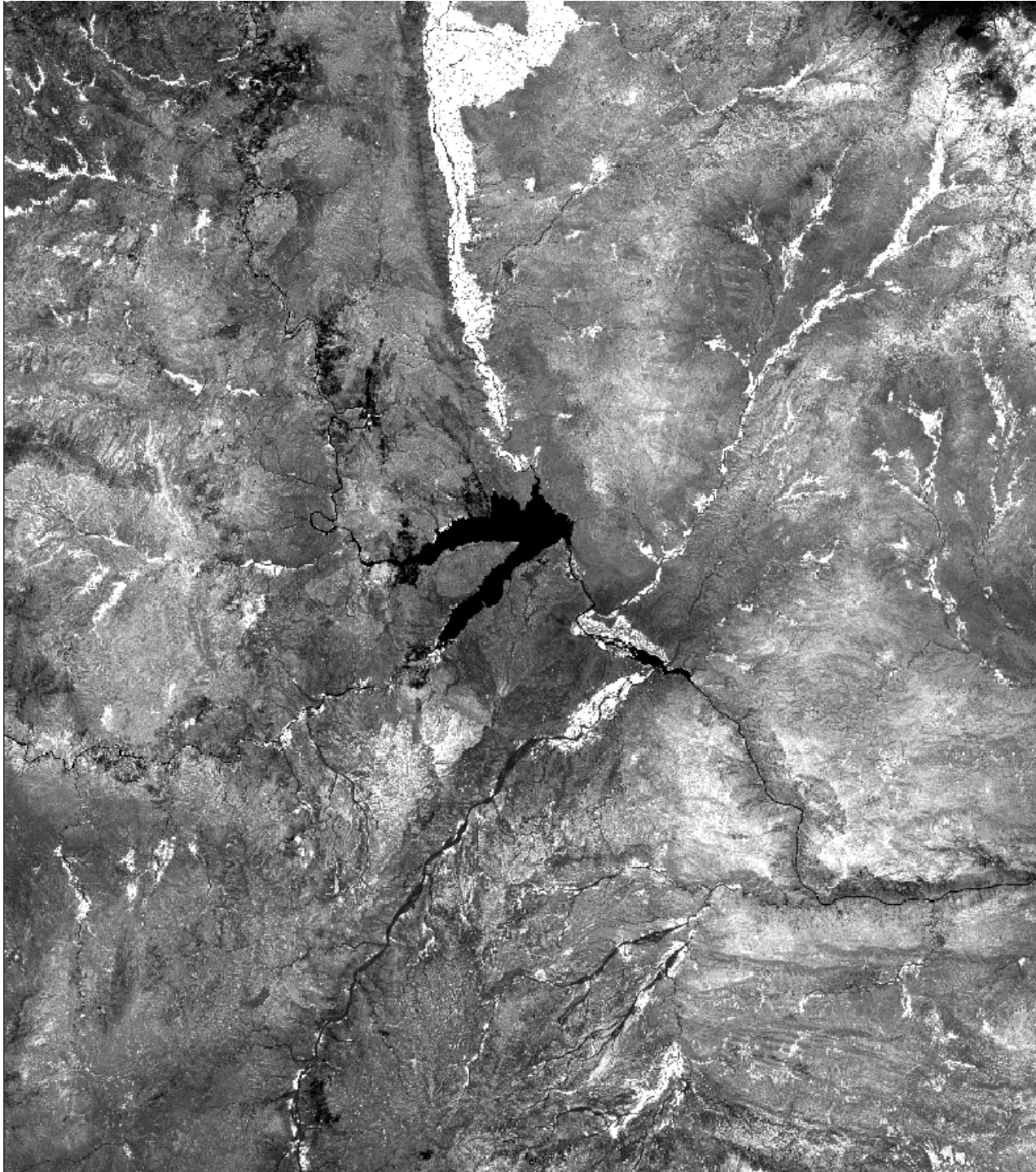
# Haze removal after correction; 2015-12-01 – Sentinel2- L2C (B1)



NDVI -

Before and After Correction



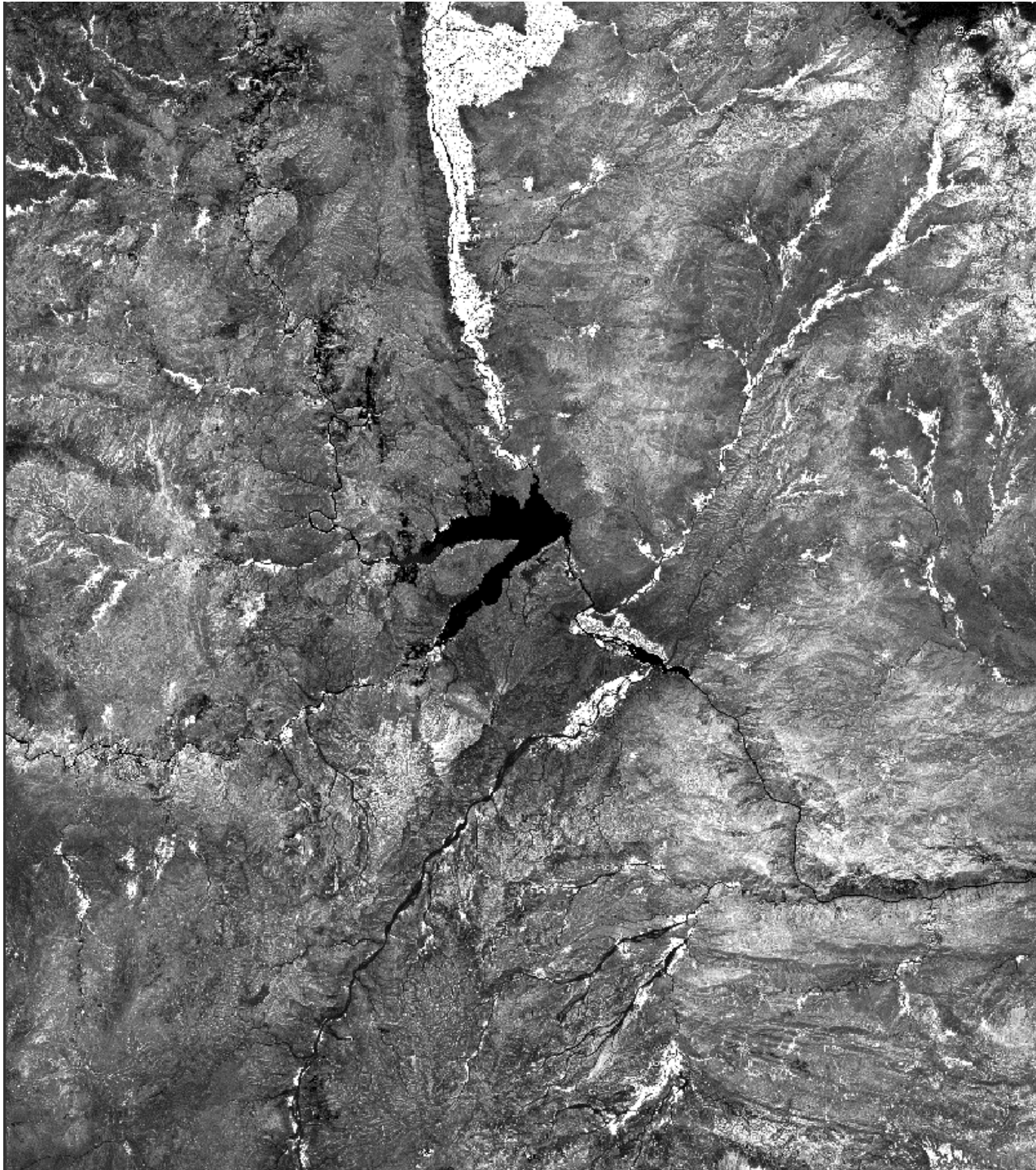


2016\_04\_27

NDVI -

Before





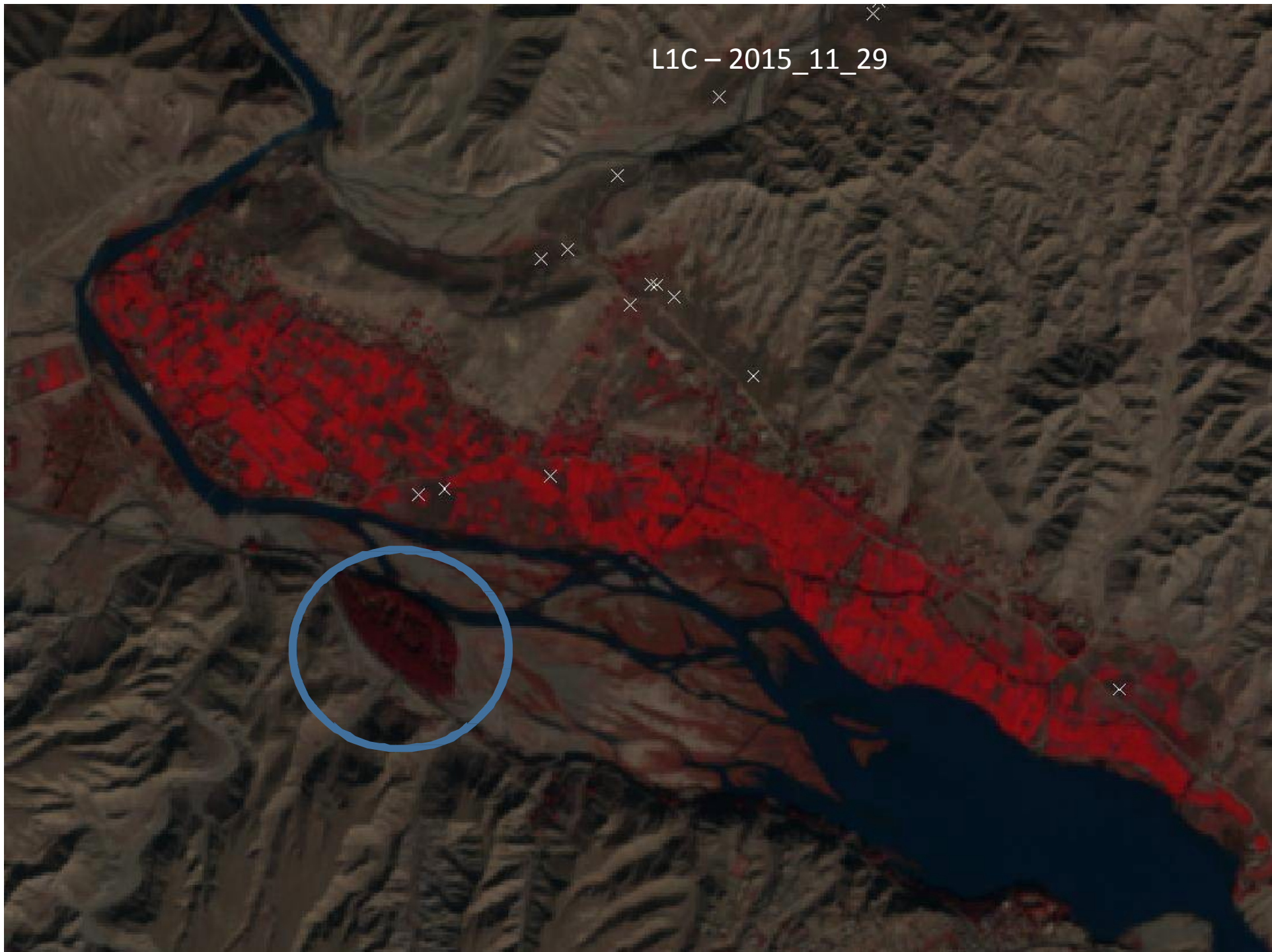
2016\_04\_27

NDVI -

After

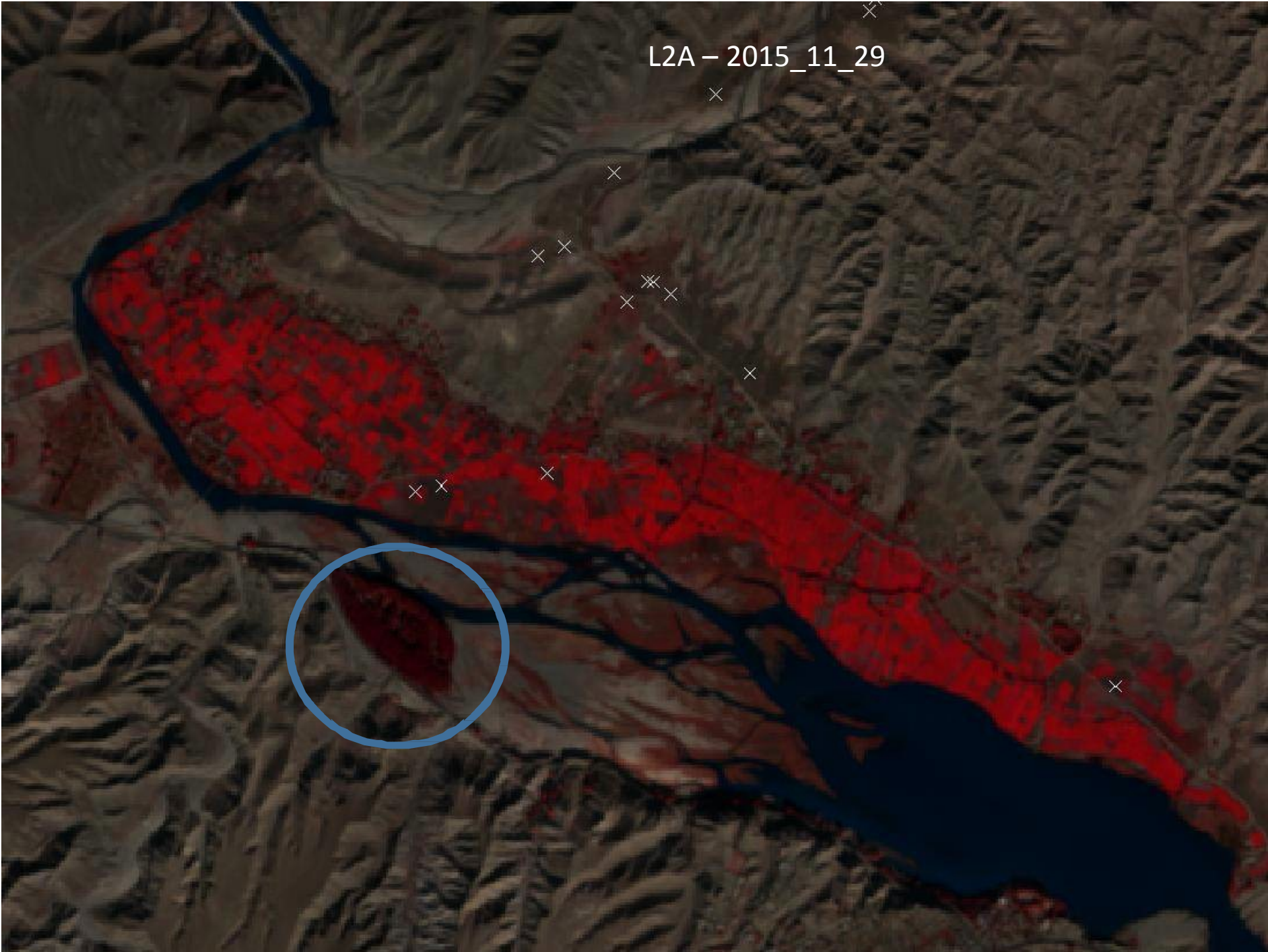
False Color Composite -  
Sentinel- 4,3,2

L1C - 2015\_11\_29





L2A - 2015\_11\_29



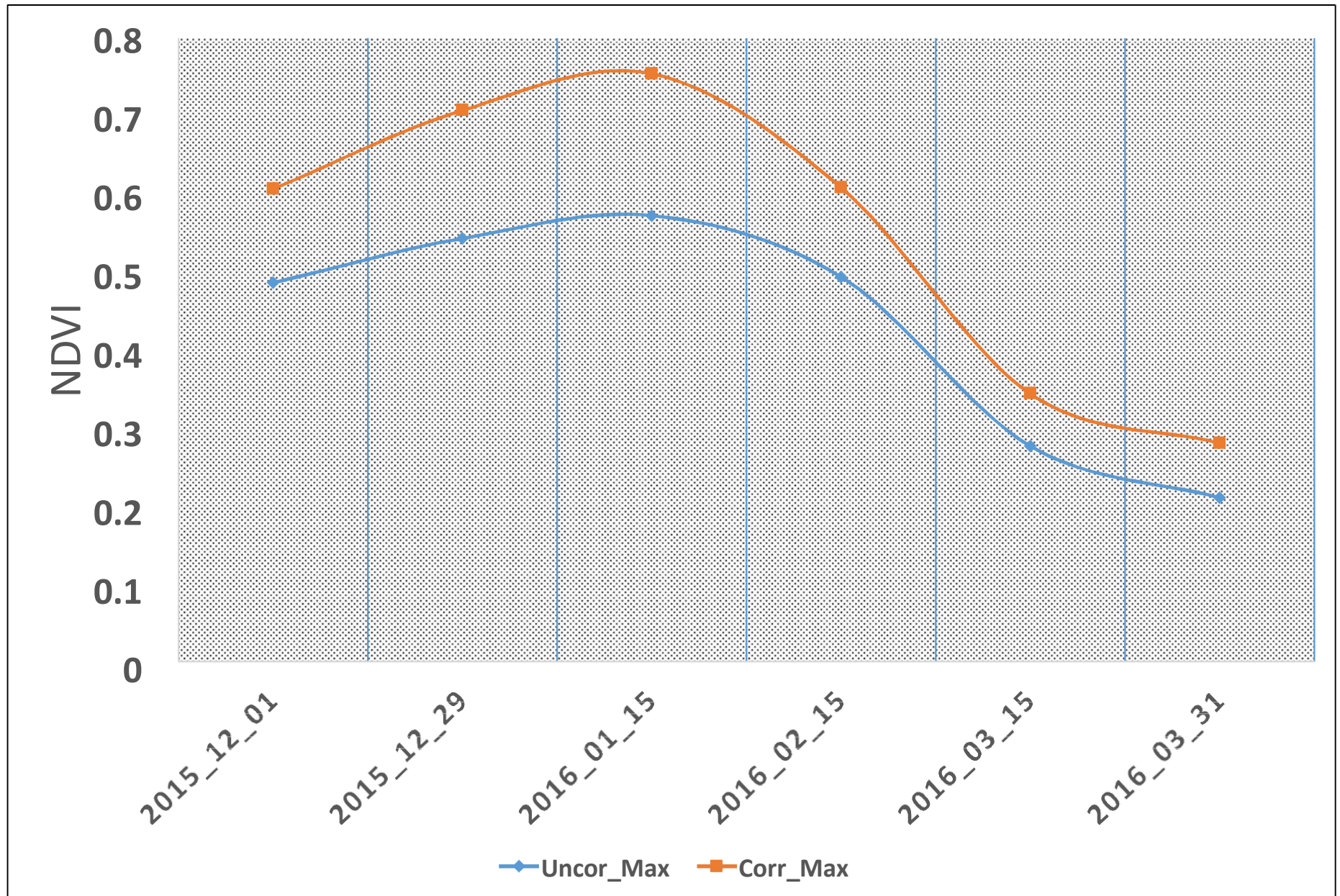


# Questions - Revisited

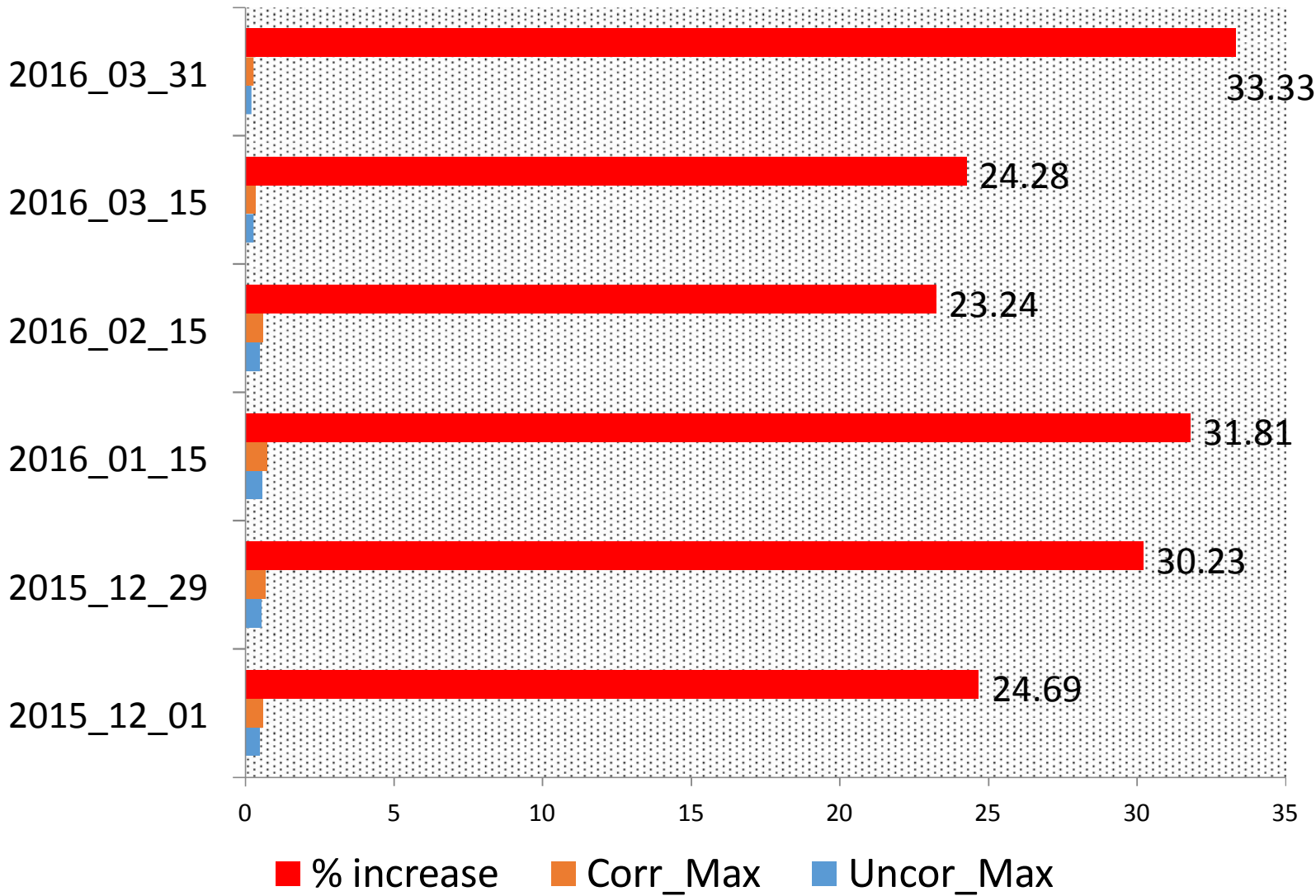
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# Results – Uncorrected vs. Corrected NDVI for Wheat



# Percent Increase In Surface Reflectance



# Results

- Across all images, on an average 27.93% improvement has been observed after correction.
- The improvement ranged from 23.24% - 33.33%.
- It is worth using surface reflectance images rather than top of reflectance images (over the Kabul region in Afghanistan)
- Next Step – compare 6S with Sen2Cor



# ACIX: CEOS-WGCV Atmospheric Correction Inter-comparison Exercise (ESA/NASA/UMD)

The exercise aims to bring together available AC processors (**actually 14 processors including SEN2COR, MACCS, L8-S2-6SAC, ...**) to generate the corresponding SR products.

The input data will be **Landsat-8 and Sentinel-2 imagery** of various test sites, i.e. coastal, agricultural, forest, snow/artic areas and deserts.

## Objectives

- To better understand uncertainties and issues on L8 and S2 AC products
- To propose further improvements of the future AC schemes

\* 1<sup>st</sup> Workshop in June 21<sup>st</sup>-22<sup>nd</sup> 2016 @ University of Maryland: to elaborate concepts, protocols and guidelines for the inter-comparison and validation of SR products

- 2<sup>nd</sup> workshop in April 2017
- Results to be finalized in fall 2017

<https://earth.esa.int/web/sppa/meetings-workshops/acix>

*Demonstration of tool with much more specifics (on atmospheric parameterization file) will be presented after Day-2 - Krishna*