



**Fuel load mapping in the Cerrado**  
Monitoring concept in support of MIF implementation

Jonas Franke – RSS GmbH





Cerrado

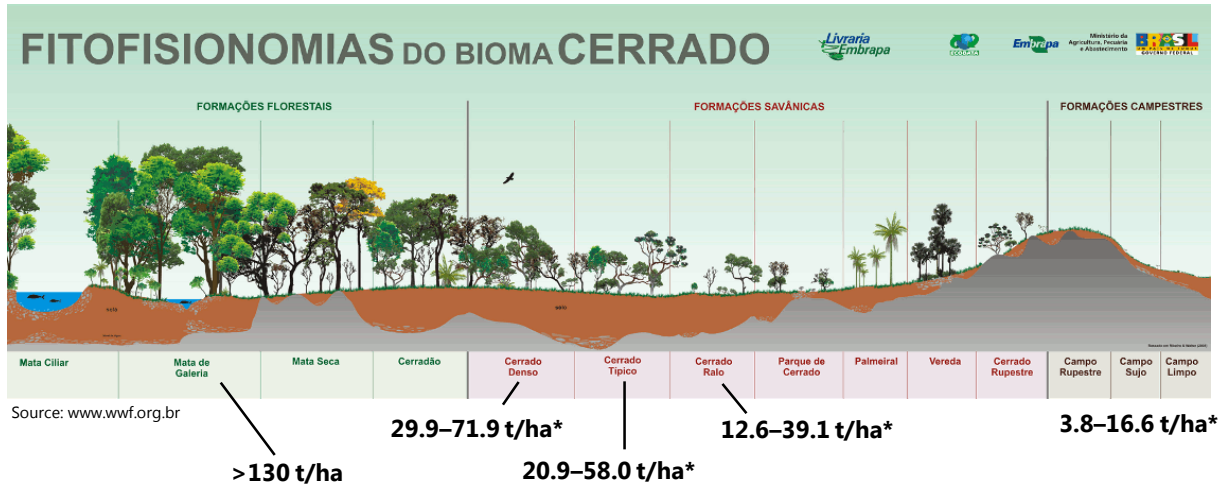
Most biodiverse savannah in the world, containing **5%** global biodiversity

2nd largest biome in South America, occupying almost 25% of the Brazilian territory

Globally significant carbon sink

Brazil's agricultural reserve, responsible for more than 50% of agricultural production

Responsible for **40% CO<sub>2</sub> emissions** resulting from changes in land use in Brazil



Source: www.wwf.org.br



\*Ottmar et al. (2001): Stereo Photo Series for Quantifying Cerrado Fuels in Central Brazil – Volume I

Photos: J. Franke

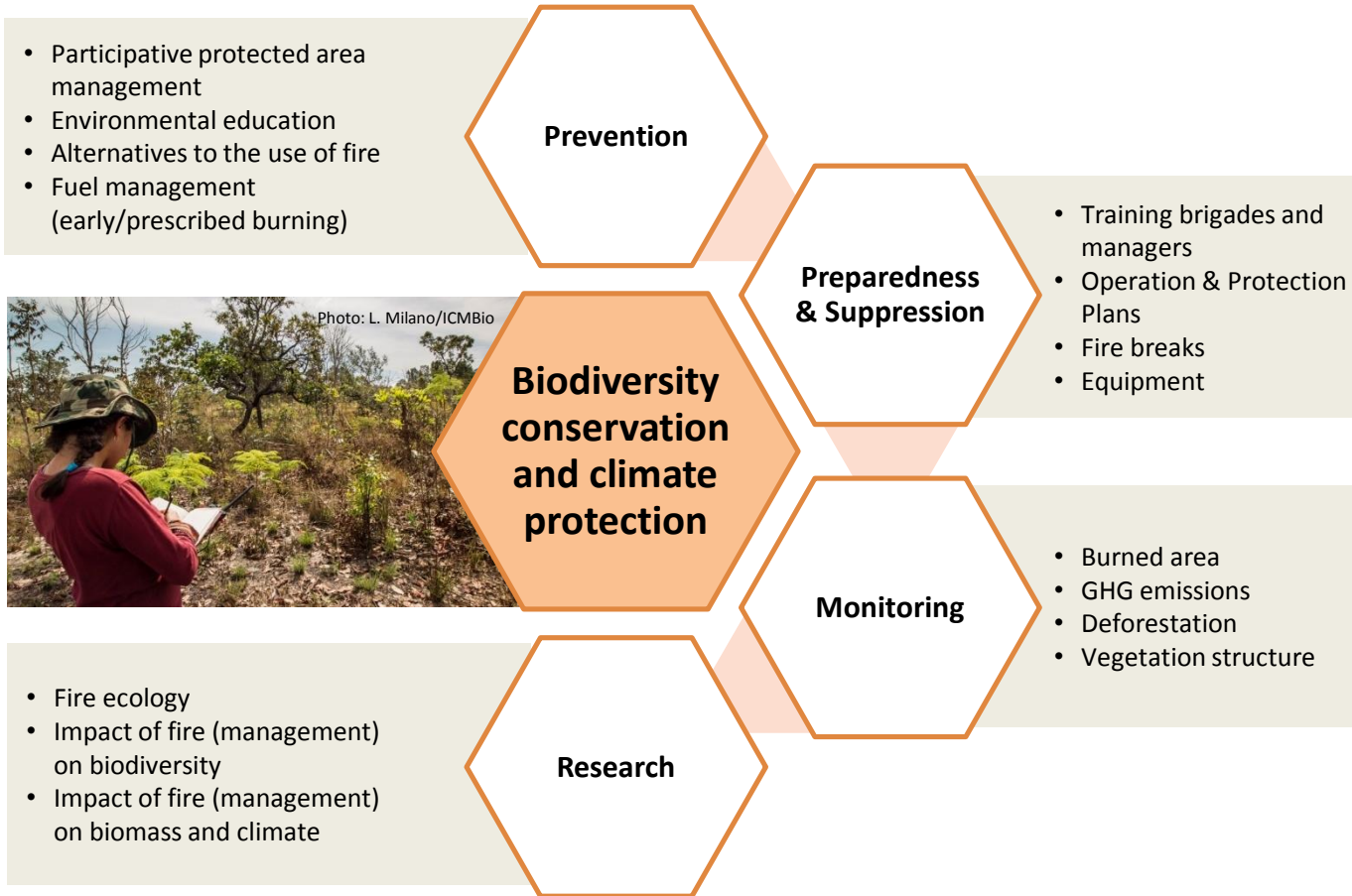


Photo: L. Milano/ICMBio



## Integrated Fire Management (IFM)



Fragmenting larger areas by creating a network of fire breaks or by creating patches of burned areas

- Reduces the areas affected by high-intensity fires
- Facilitates fire suppression
- Provides habitat for small mammals in fragments



Applying low-intensity, early burning practices to avoid late season, high-intensity fires results in

- Reduced loss of biomass (greater carbon stock)
- Reduced GHG emissions and promotes biodiversity

### Early burning



- Low-intensity fires
- Low impact biodiversity
- Reduce fuel load to avoid late season, high-intensity burning
- Low risk of dispersion

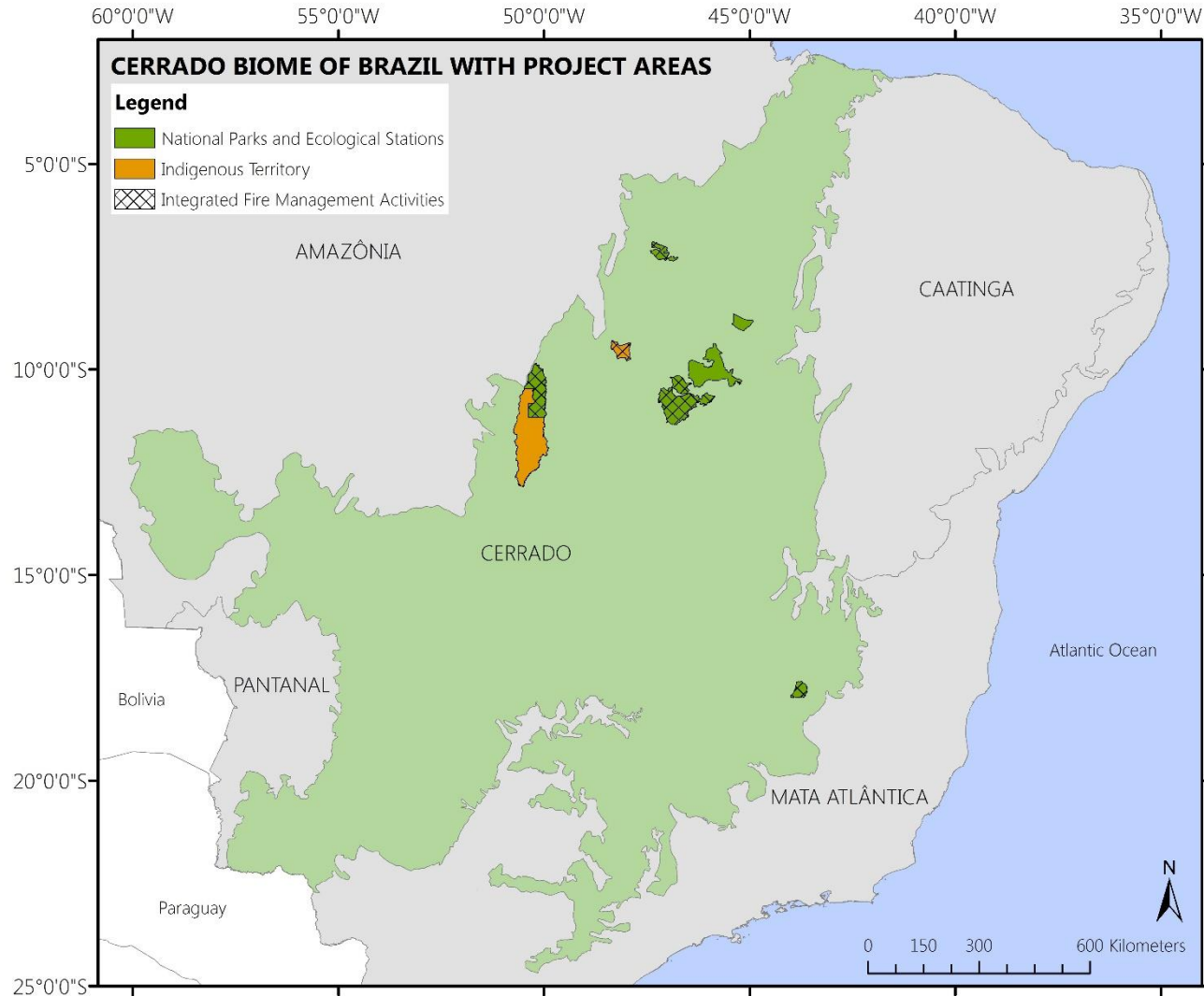
### Late burning



- High-intensity fires
- Damaging for biodiversity
- Greater loss of biomass
- High risk of dispersion; difficult to contain

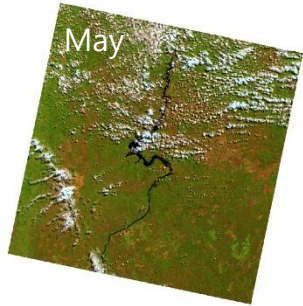
 **Planning and implementation of IFM and prescribed burning activities require information on the distribution and amount of fuel loads**

## Pilot areas





„Early dry season“ image  
Landsat 8

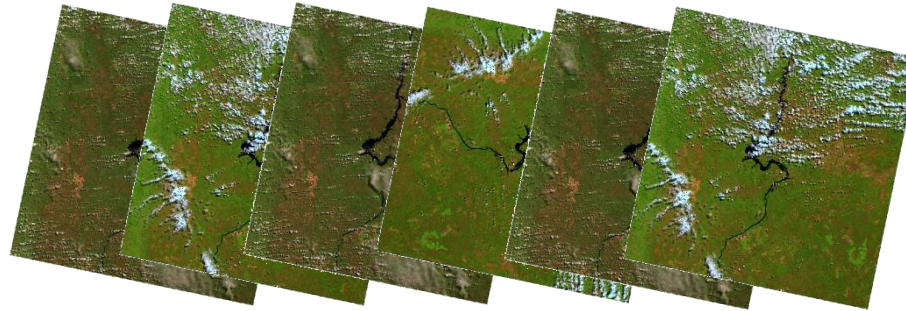


Spectral Mixture Analysis (RSS)

Estimation of dry biomass  
(Fuel load maps)



Monitoring of fires in the dry season  
16 days cycle of Landsat



Interpretation of time series (Park Managers)

Updated information on fire locations and burned areas

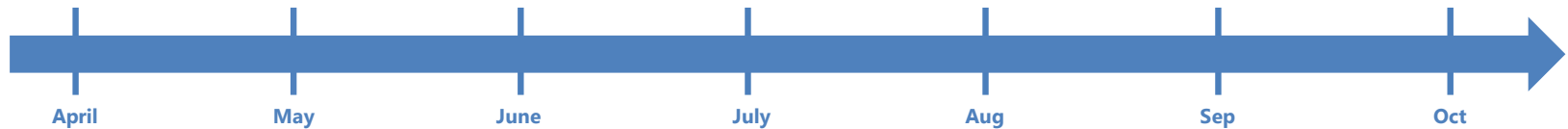
Monitoring of controlled- and wildfires

„Late dry season“ Image  
Landsat 8

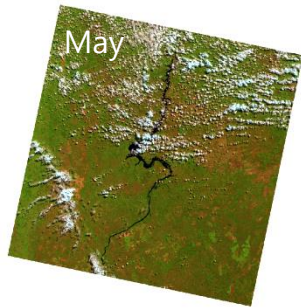


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Estimation of dry biomass  
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Landsat 8

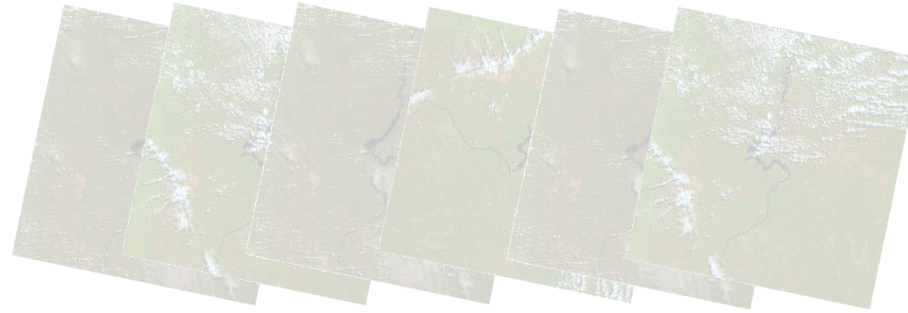


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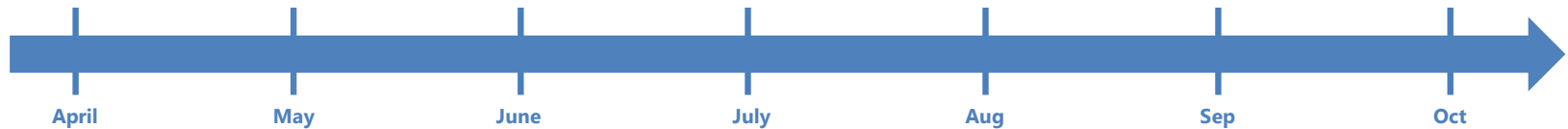
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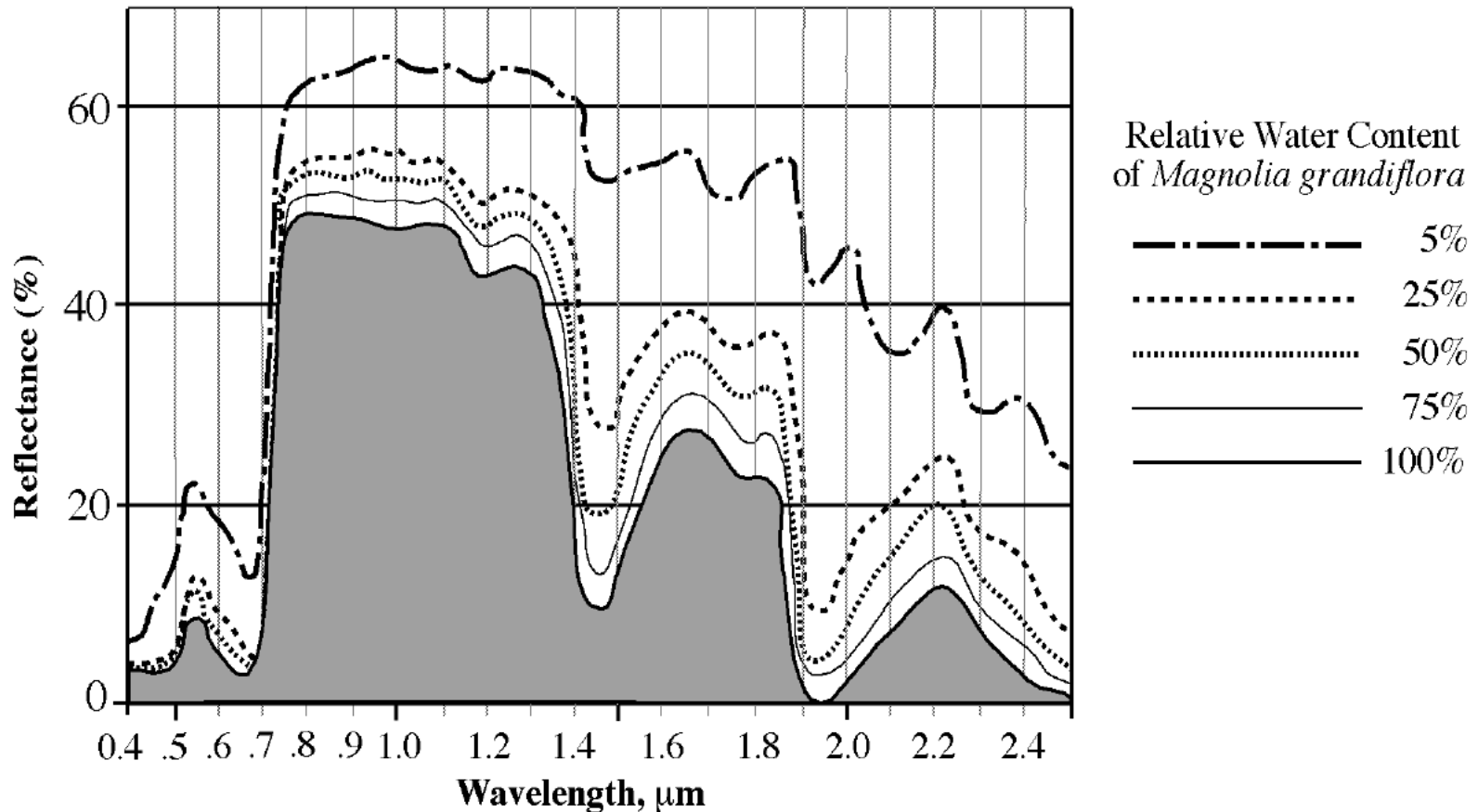
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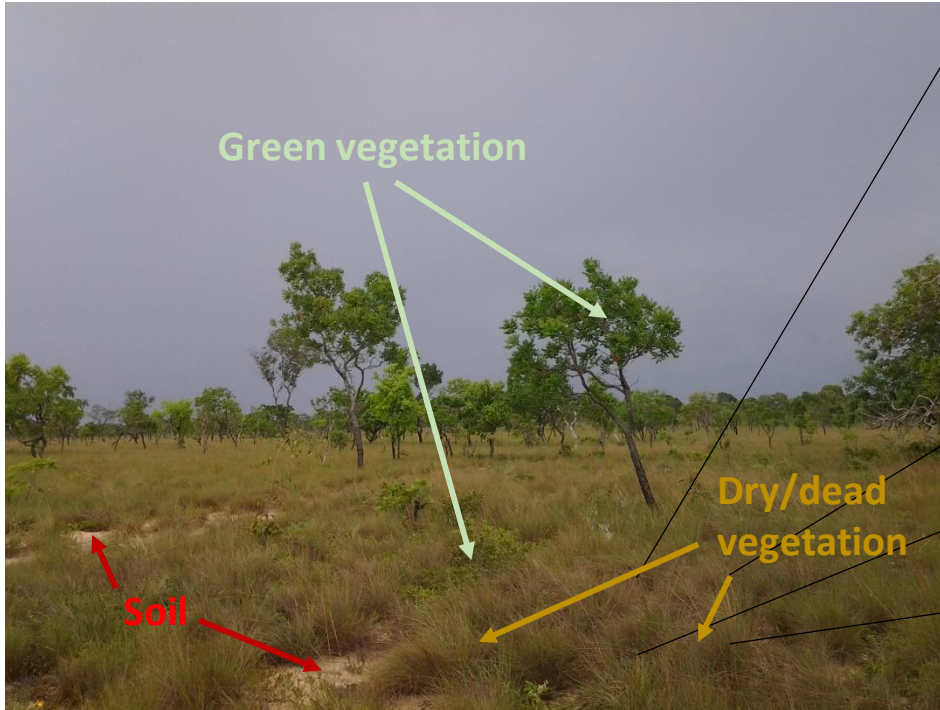


## Leaf's spectral response to reduced water content

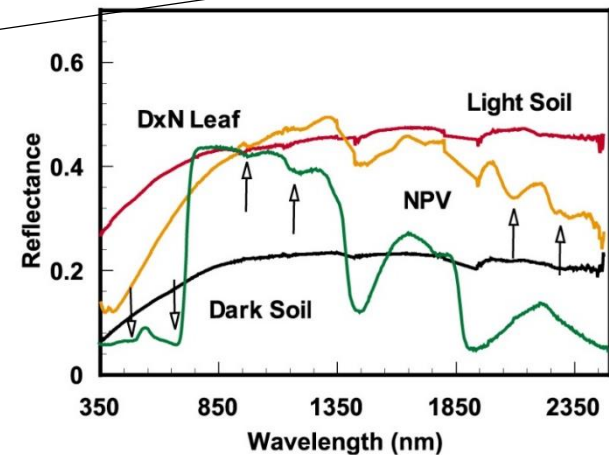


Cerrado consists mainly of three spectral components:

- Green vegetation
- Dry/dead vegetation
- Soil

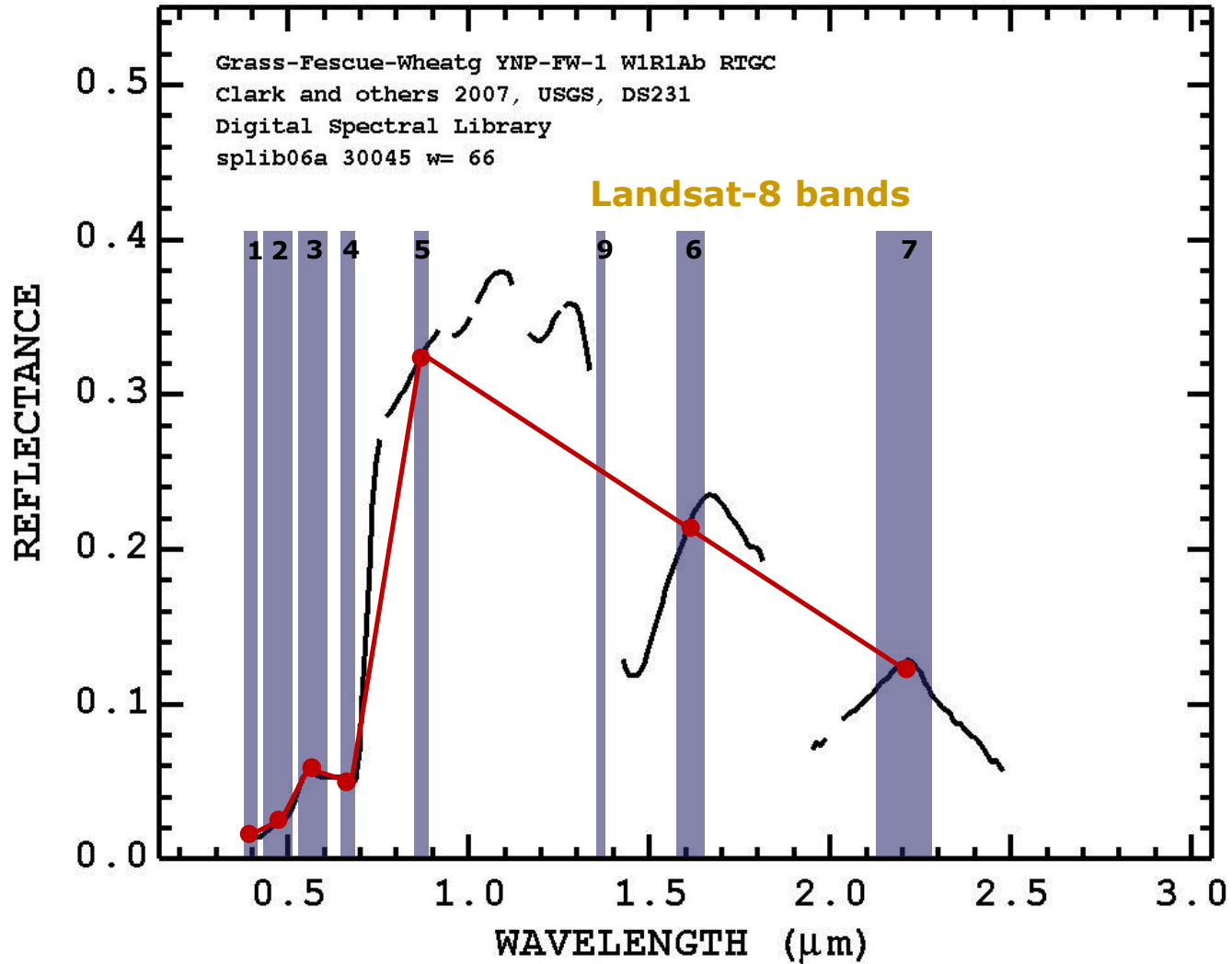


→ Mixed Pixel Problem



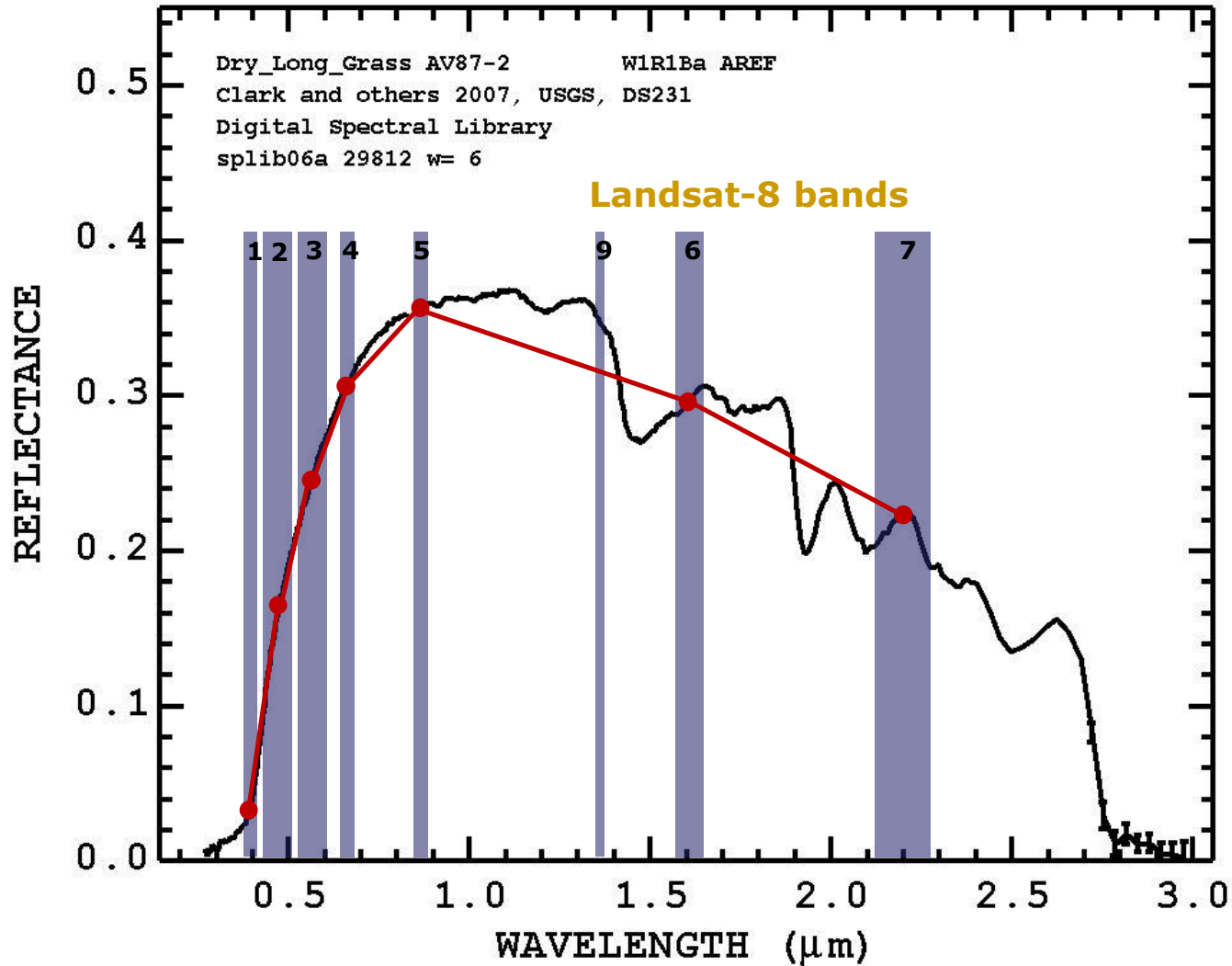


Spectral signature from the USGS spectral library: example grass



Source: <http://speclab.cr.usgs.gov/spectral.lib06/ds231/datatable.html>

Spectral signature from the USGS spectral library: example grass



Source: <http://speclab.cr.usgs.gov/spectral.lib06/ds231/datatable.html>



- Is an advanced image exploitation tool designed to detect materials that are smaller than an image pixel
- It addresses the „mixed pixel problem“

## Advantages:

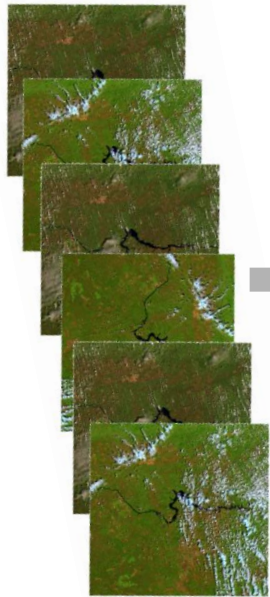
- Identifies objects/materials that are smaller than the spectral resolution of the sensor
- Identifies specific materials in mixed pixels
- Can be used for many types of applications
- Scene-to-scene transferable spectral signature
- It can detect and identify materials covering an area as small as 20% of a pixel

- MTMF only needs one defined endmember spectrum
  - It is a partial unmixing, in which the known signature is matched by a matched filter calculation
  - The MTMF required a minimum noise fraction transformed image and a MNF-transformed endmember spectrum
  - Result is a grey-scales matched filtering fraction image (with physical meaning) representing the estimated relative degree to which each pixel machted the reference spectrum
  - Additionally a grey-scale infeasibility image generated by a mixture tuning calculation, which estimates the likelihood that a pixel, in spite of its high MF-fraction values represents unknown endmembers
- ➔ Low infeasibility values and with high fraction values indicate a good endmember match



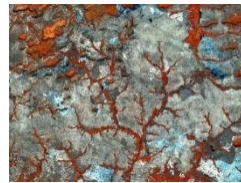
## Landsat-8 time series

Jan. 2014 to March 2015 (14/28)  
All images with <50% cloud cover



ATM correction

## High-resolution RapidEye image

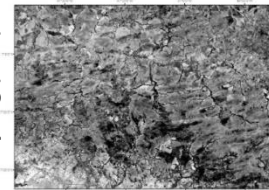


Endmember  
Selection  
(GV, NPV, Soil)

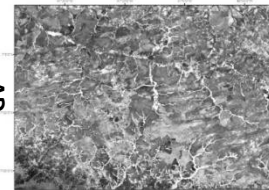
MNF Transformation

Mixture Tuned Matched Filtering

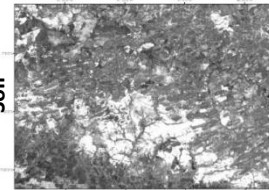
Dry veg (NPV)



GV



Soil



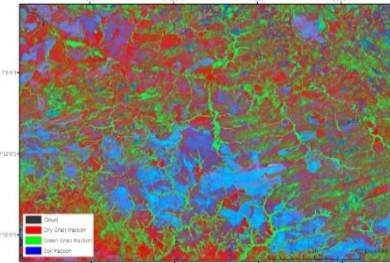
## Matched Fraction Images

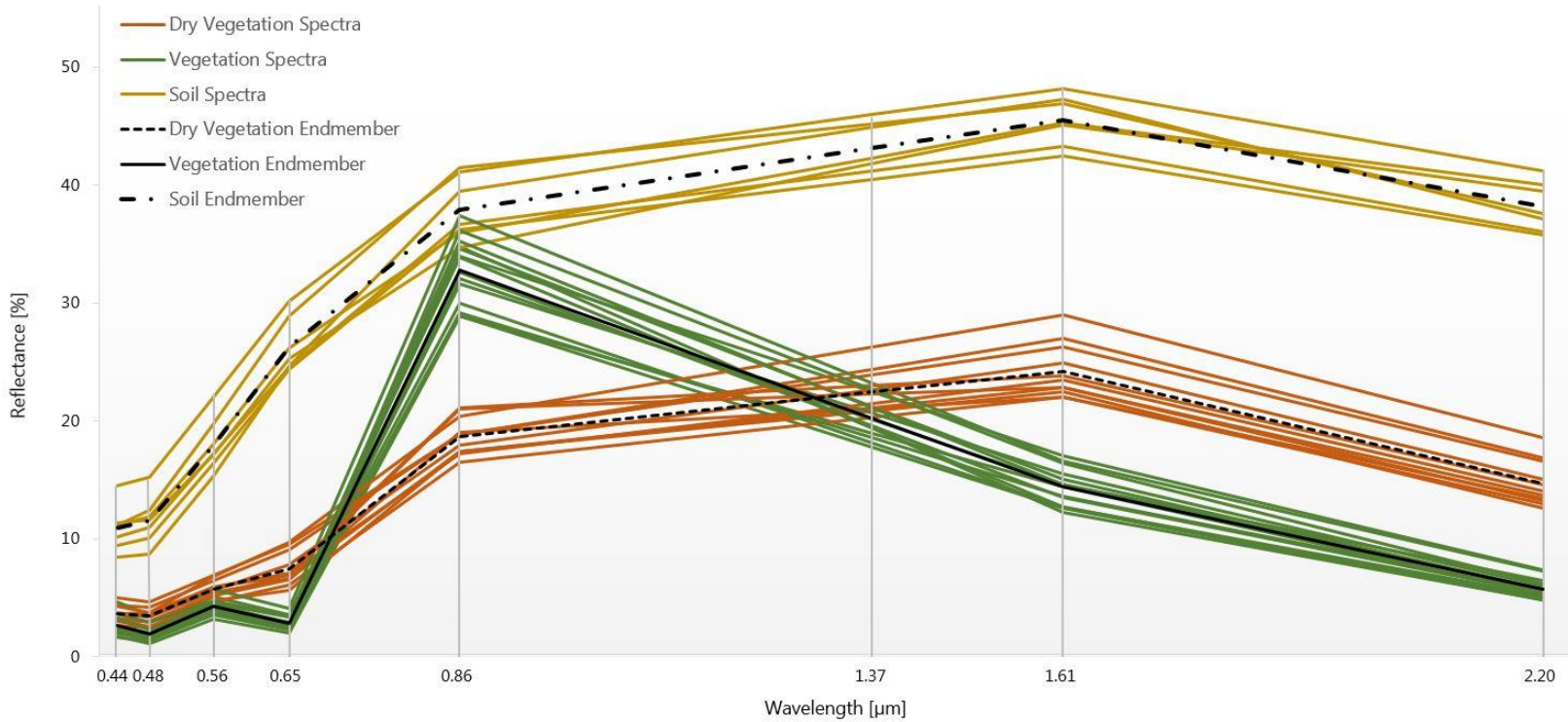
R

G

B

## Fuel Load Maps

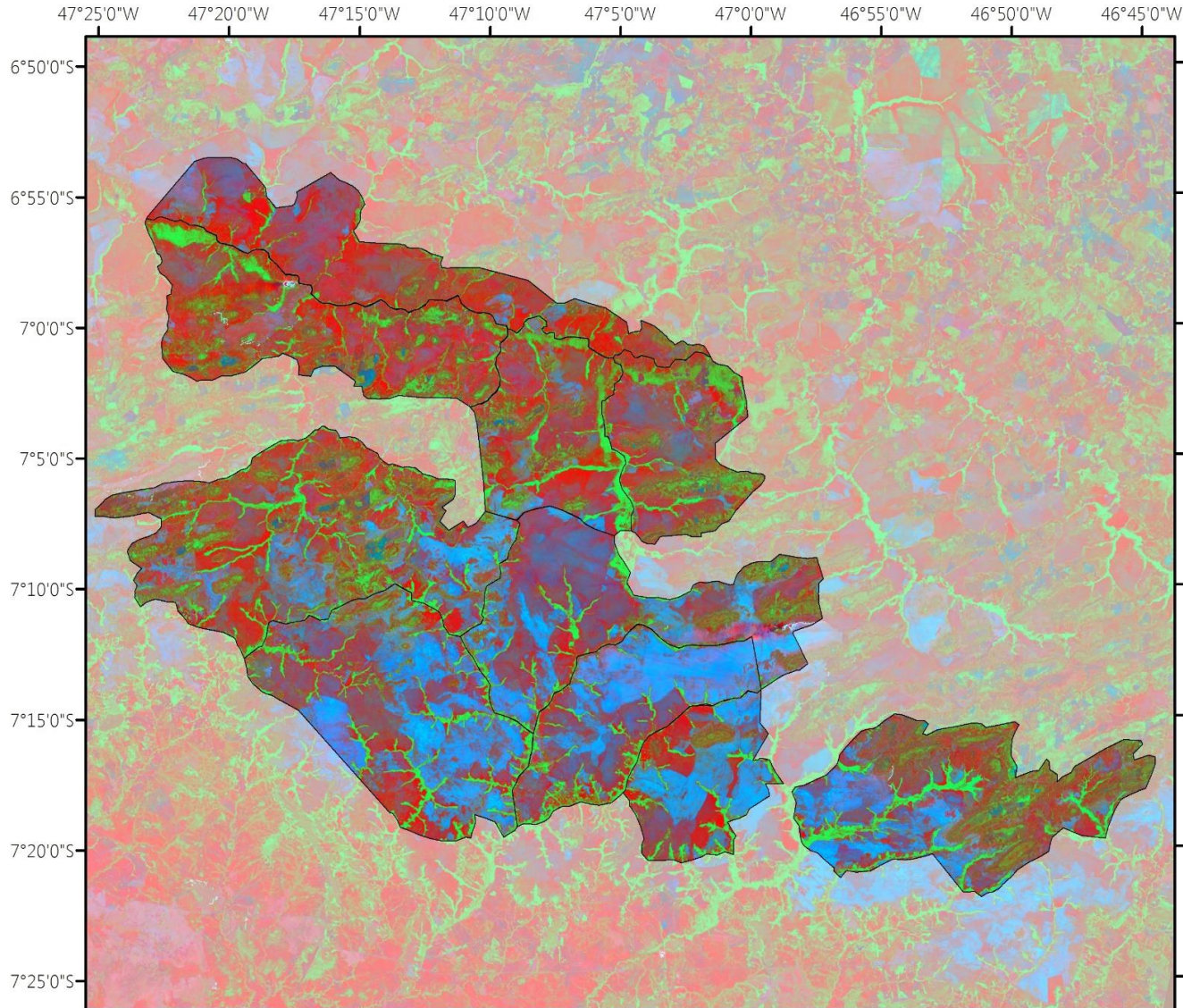




Fuel Load Maps have been provided supporting the implementation of IFM in protected areas:

- PN da Chapada das Mesas
- PN do Araguaia
- PN Sempre Vivas
- Parque Estadual do Jalapão
- Estacao Ecologica Serra Geral do Tocantins
- Terra Indígena Xerente
- APA Jalapão

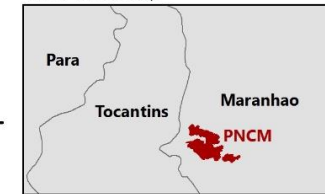




## Parque Nacional da Chapada das Mesas

Fraction image for dry veg.,  
green veg. and soil  
September 09, 2014

### Overview Map



### Legend

 Management zones PNCM



### Interpretation

This map shows the distribution of dry veg., green veg. and soil as derived from Landsat-8 by a spectral mixture analysis. Red colors indicate a high abundance of dry veg. and blue colors indicate a high soil fraction with a continuous mixture of both (purple). Green areas mainly represent dense Cerrado, gallery forests and green grass.

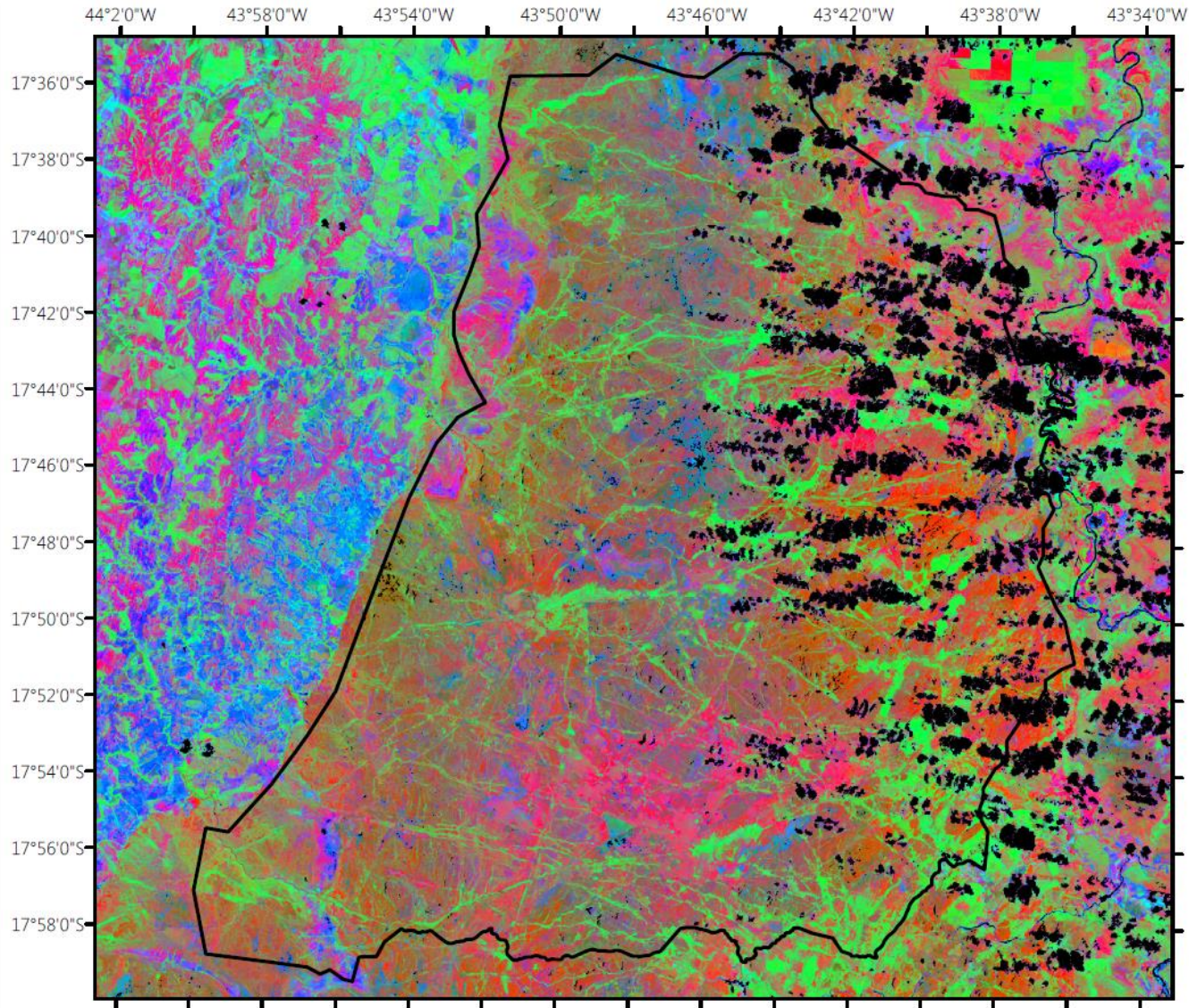
### Cartographic Information

Scale: 1: 370,000

Produced: RSS GmbH







## PN Sempre Vivas

Fraction image for dry veg.,  
green veg. and soil  
January 19, 2015

### Overview Map



### Legend

- Cloud/Cloudshadow
- PN Sempre Vivas



### Interpretation

This map shows the distribution of dry grass, green veg. and soil as derived from Landsat 8 by the spectral mixture analysis. Red colors indicate a high abundance of dry grass and blue colors indicate a high soil fraction with a continuous mixture of both (purple). Green areas mainly represent dense Cerrado, gallery forests and green grass.

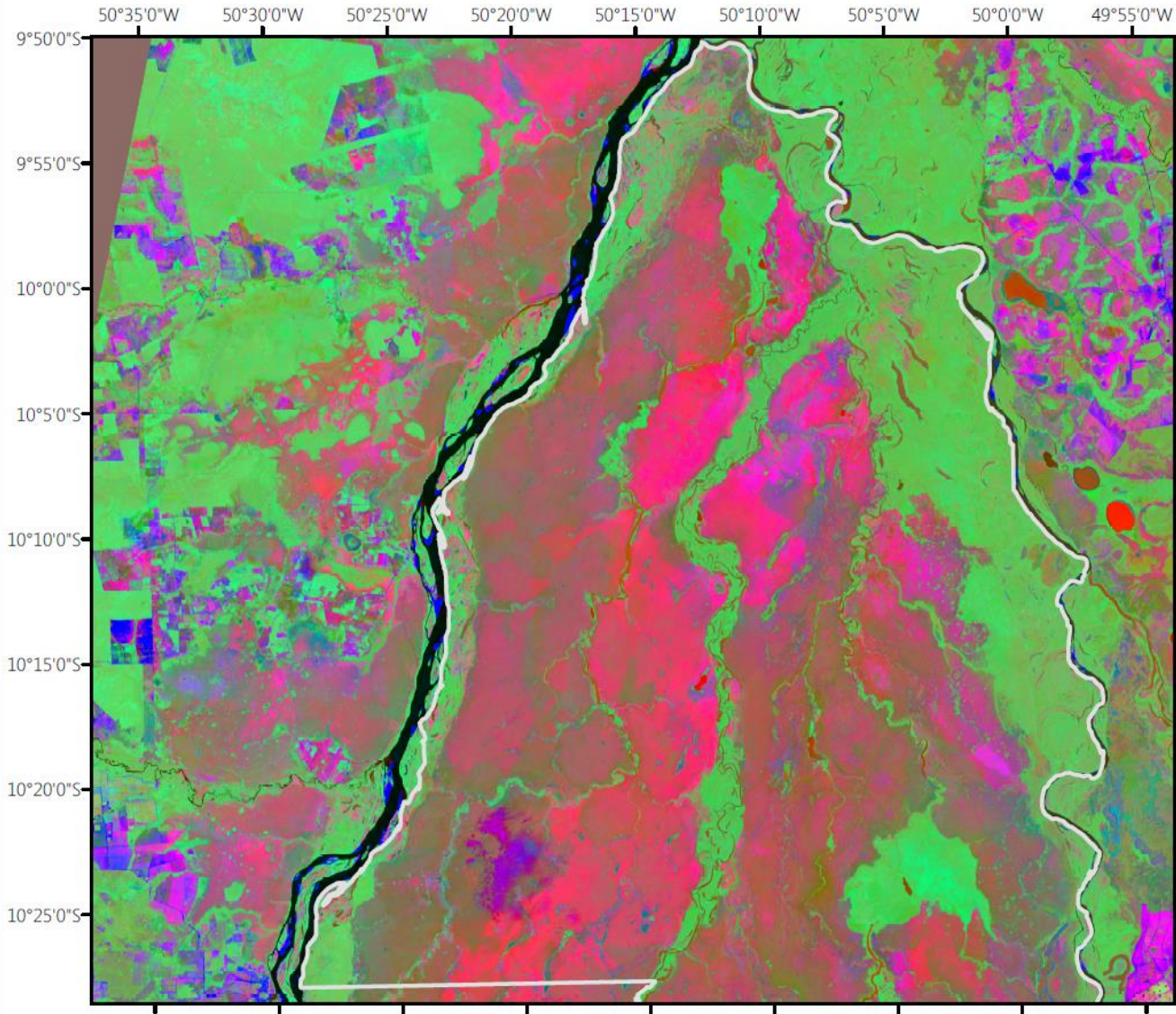
### Cartographic Information

Scale: 1: 250,000

Produced: RSS GmbH







## Parna do Araguaia Norte

Fraction image for dry grass,  
green grass and soil  
June 06, 2015

### Overview Map



### Legend

Parna do Araguaia



### Interpretation

This map shows the distribution of dry grass, green veg. and soil as derived from Landsat 8 by a spectral mixture analysis. Red colors indicate a high abundance of dry grass and blue colors indicate a high soil fraction with a continuous mixture of both (purple). Green areas mainly represent dense Cerrado, gallery forests and green grass.

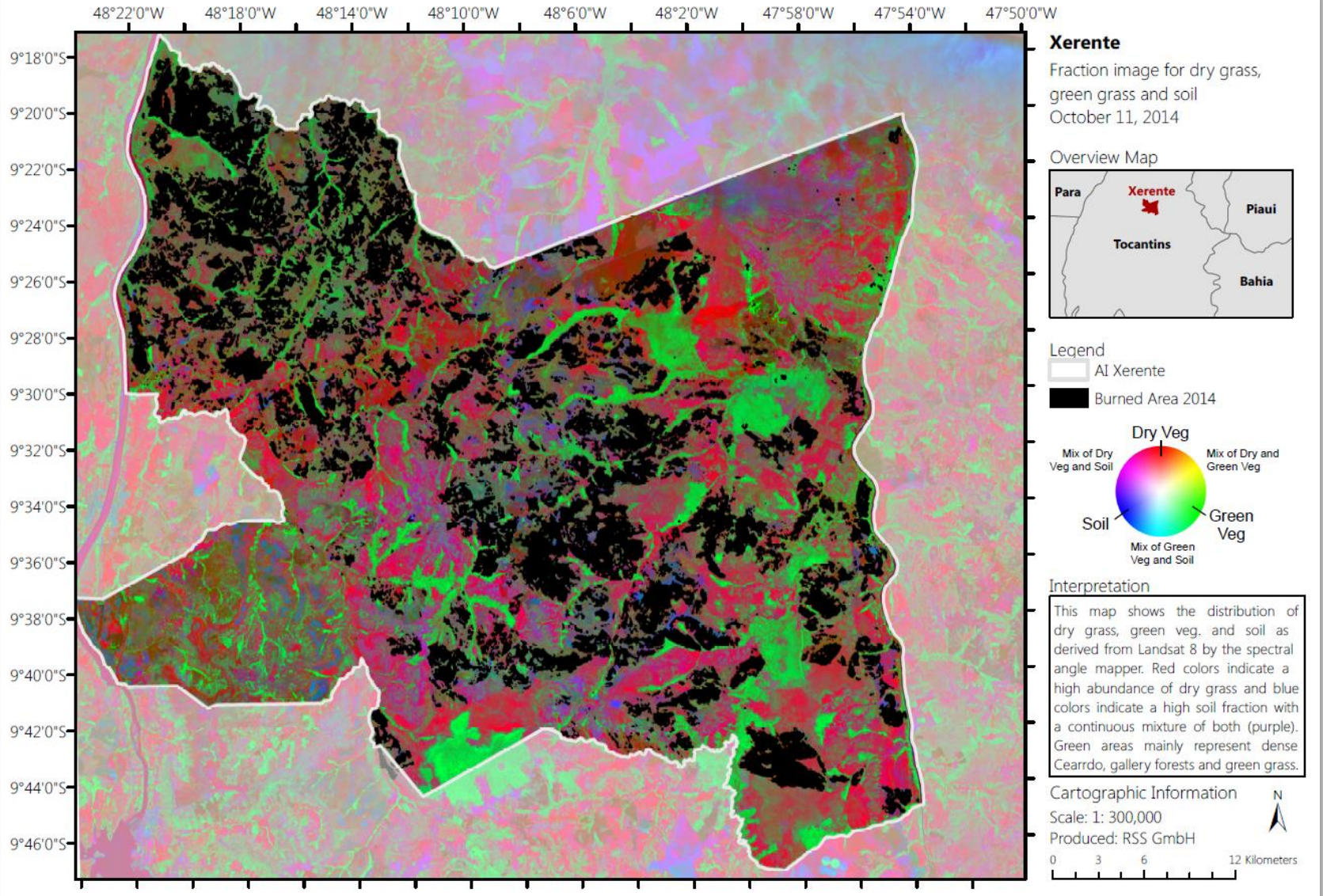
### Cartographic Information

Scale: 1: 385,000

Produced: RSS GmbH

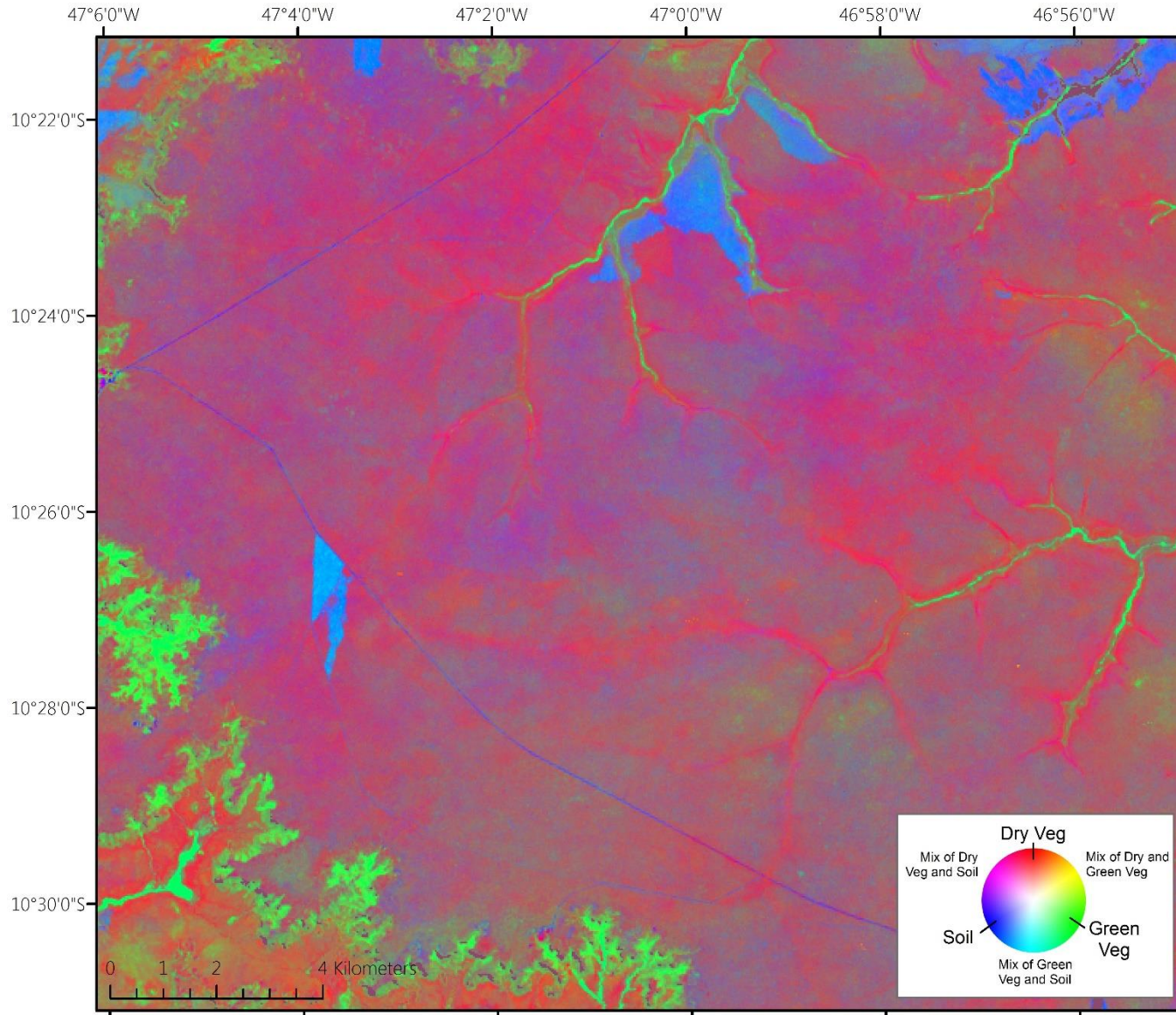




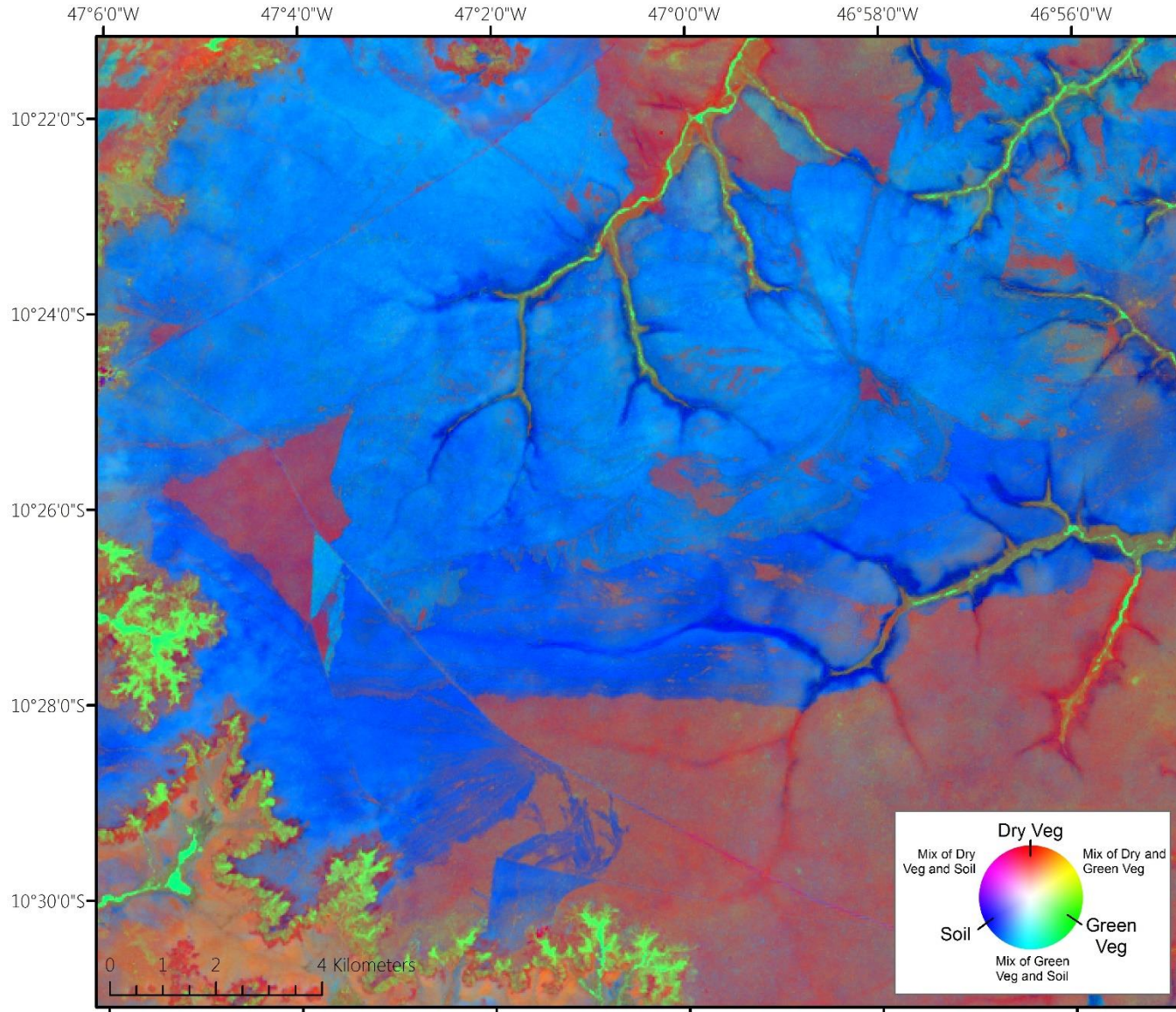




# Early dry season fuel load map (PEJ)



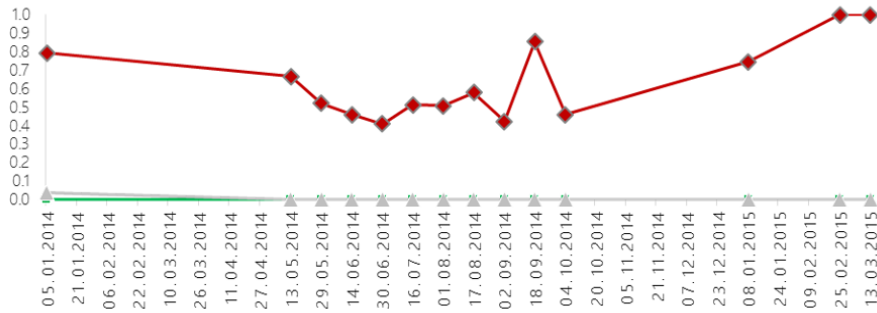
# Late dry season fuel load map (PEJ)





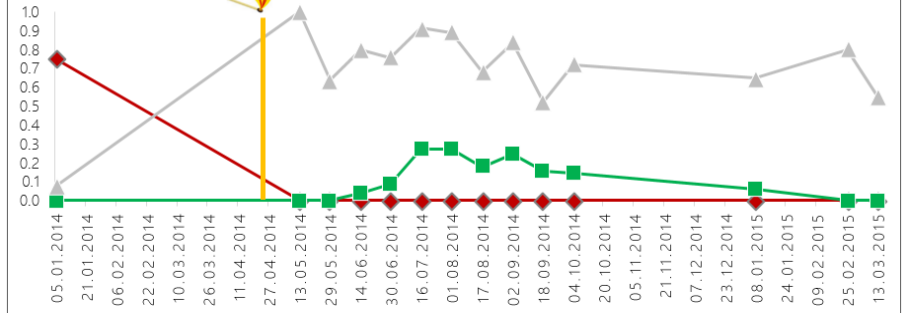
### CAMPO LIMPO - NOT BURNED IN 2013/2014

NPV GV Soil



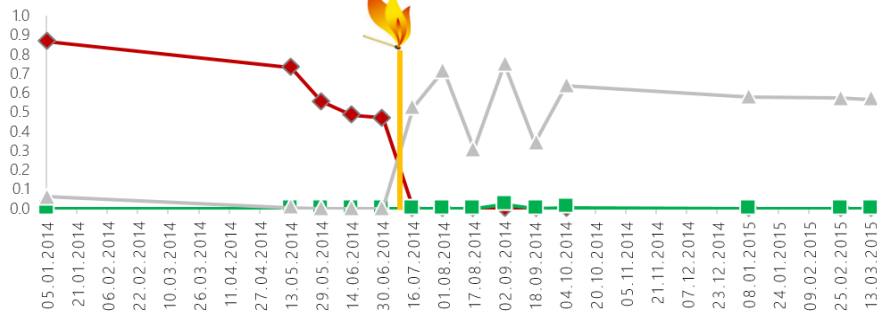
### CAMPO LIMPO - EARLY DRY SEASON BURN

NPV GV Soil



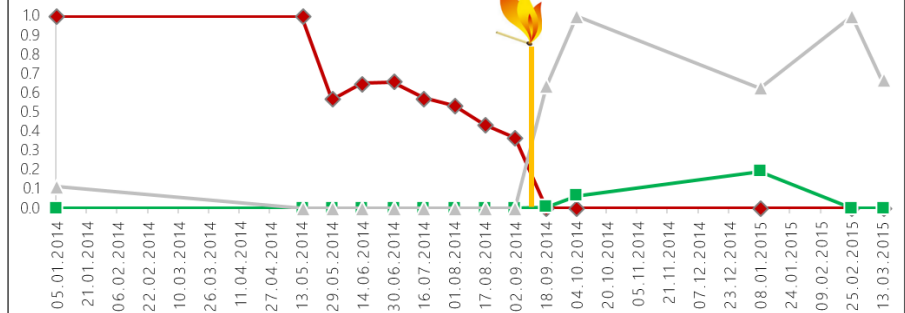
### CAMPO LIMPO - MID OF DRY SEASON BURN

NPV GV Soil

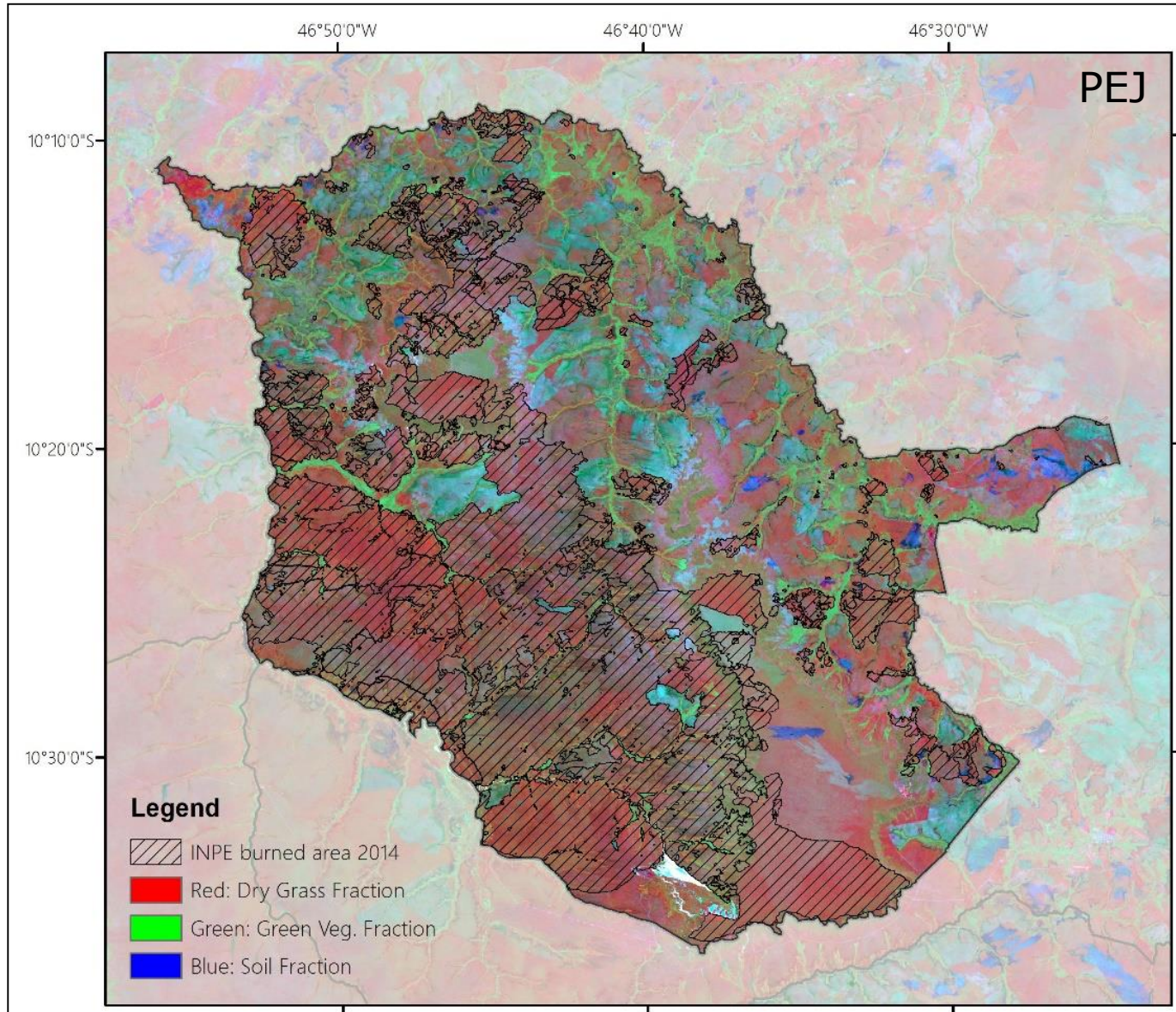


### CAMPO LIMPO - LATE DRY SEASON BURN

NPV GV Soil



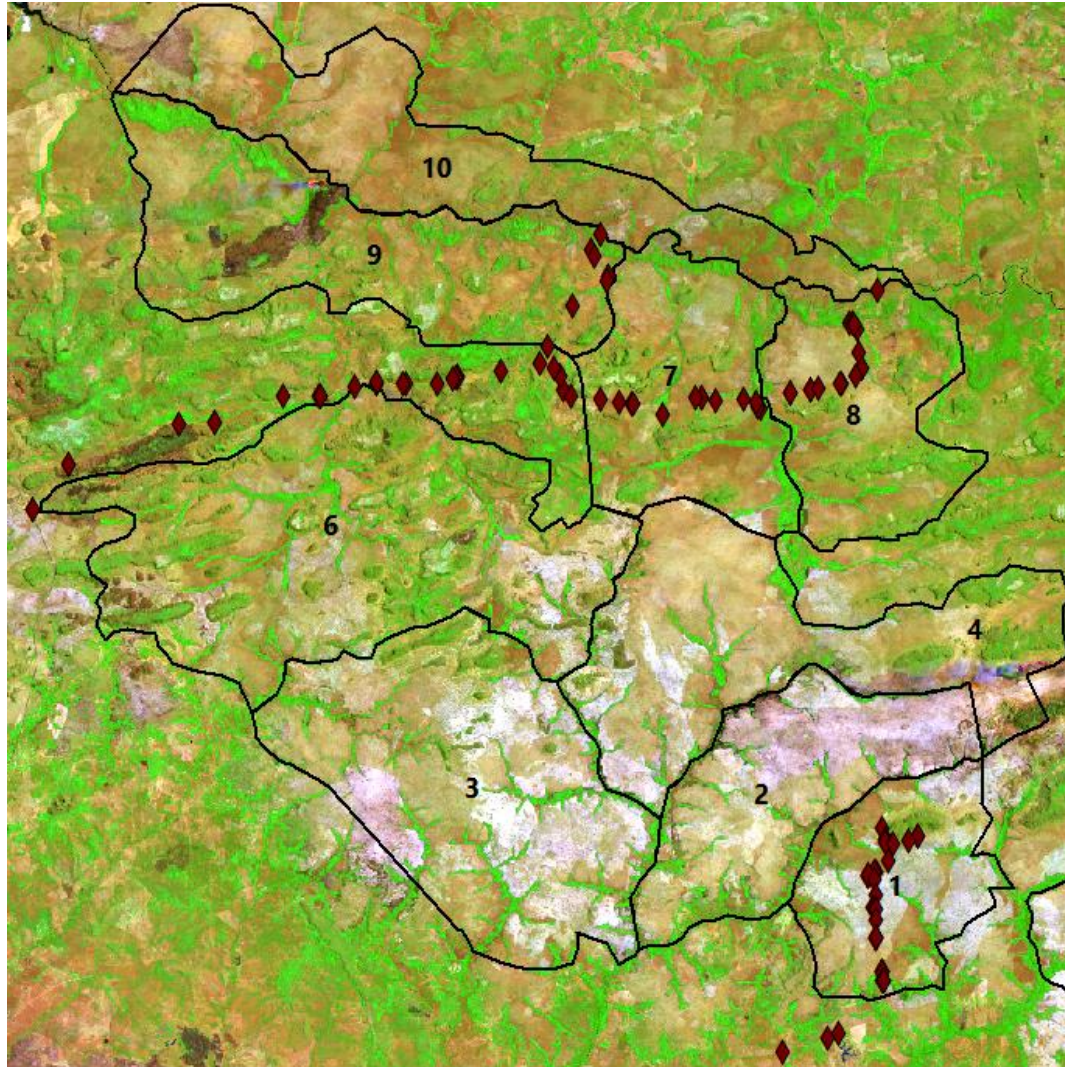
# Validation of fuel load estimates with INPE burned areas





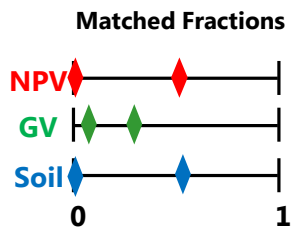
119 GPS pictures on 30.10.2014 and 02.11.2014

## PN Chapada das Mesas





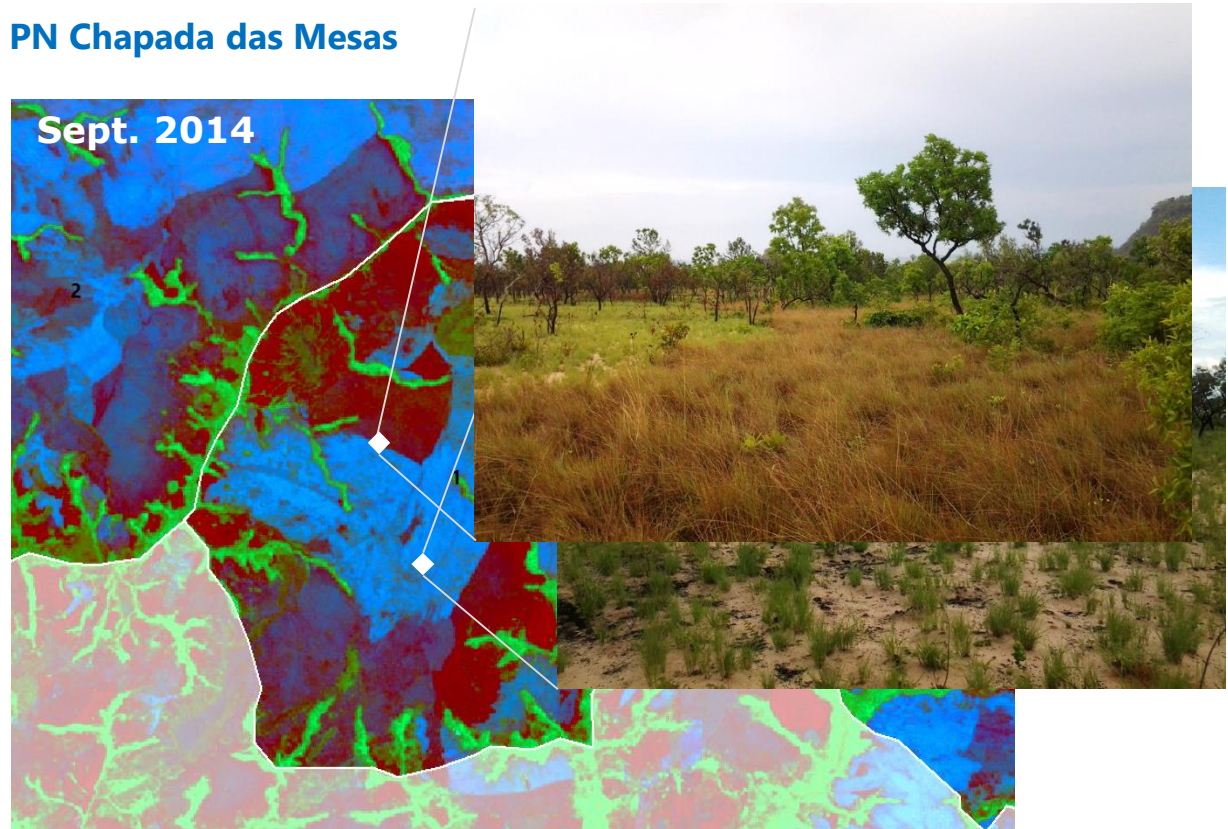
## PN Chapada das Mesas



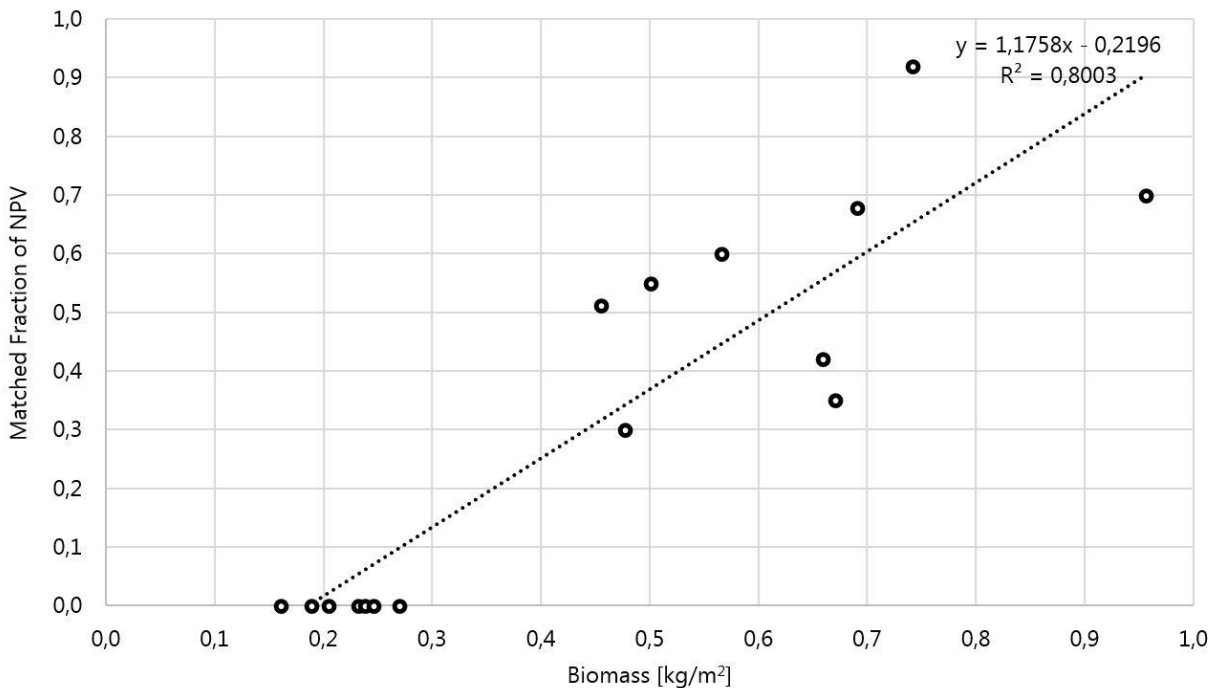
### In-situ biomass data

Pre-fire biomass (grass layer):  
**0.46 – 0.74 kg/m<sup>2</sup>**

Post-fire biomass (grass layer):  
**0.15 – 0.18 kg/m<sup>2</sup>**



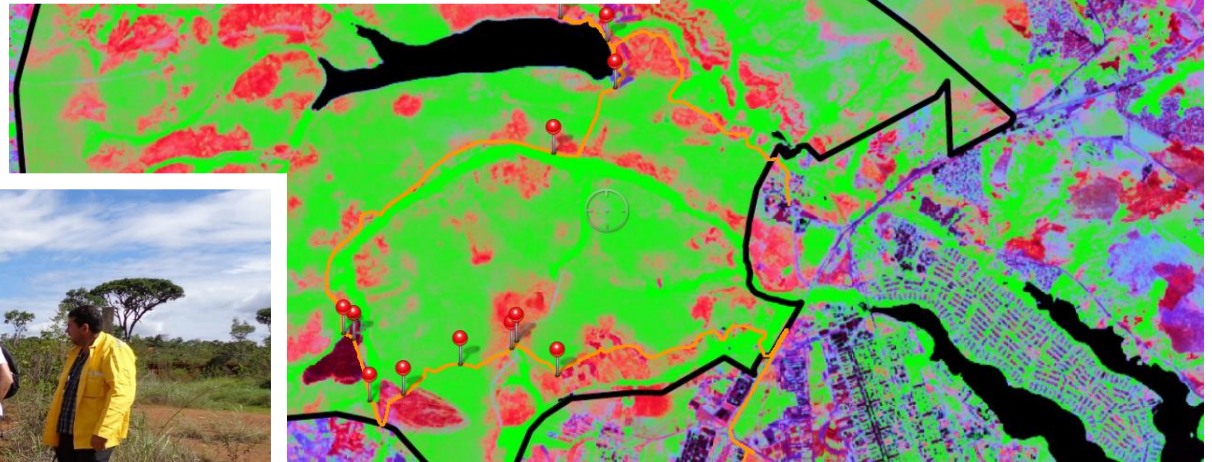
- Field data on pre- and post-fire biomass [ $\text{kg}/\text{m}^2$ ] was collected in June/July 2014 by Universidade de Brasília.
- At each sample location, all biomass with a diameter  $\leq 6\text{mm}$  was collected in 5 plots of  $0.5\text{m} \times 0.5\text{m}$  and afterwards dried and weighted.
- The average values of each location were compared with the fuel loads derived from the previous (for pre-fire samples) or next (for post-fire samples) OLI image in order to test a calibration of the results.
- In total, 16 samples could be used for validation with explicit GPS recordings and cloud-free conditions in the Landsat images.







Validation in PN Brasilia





- Fuel load mapping using Landsat-8 was demonstrated as an effective tool in support of IFM
- SMA is a well proven methodology, with results that directly supported IFM planning
- These maps are useful to identify areas with high fire risk, assess the fuel load variation, assess the remaining fuel load after a fire, to better understand fire behaviour and could improve emission estimates
- Fuel load maps were/are the planning base for controlled early burning activities in 2014/2015
- In order to establish this approach as an operational instrument of IFM, key staff of federal institutions (ICMBio, MMA, IBAMA etc.) was trained on fuel load mapping
- Sentinel-2 will provide additional data for an improved time series analysis
- The approach is transferable to other Savanna ecosystems

