



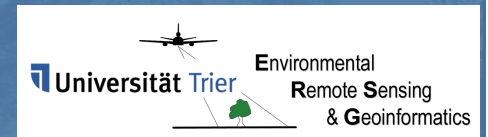
# *A Characterization of the Status and Dynamics of Land Cover in the Active Okavango Catchment*

## *Based on Various MODIS Products and Climate Data*

**Multitemp 2015**  
**8<sup>th</sup> International Workshop on the Analysis of Multitemporal Remote Sensing Images**  
Annecy, France  
22<sup>nd</sup> to 24<sup>th</sup> July, 2015

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Manfred Finckh  
Biodiversity, Evolution and Ecology of  
Plants, Biocentre Klein Flottbek and  
Botanical Garden, **University of  
Hamburg**, Germany

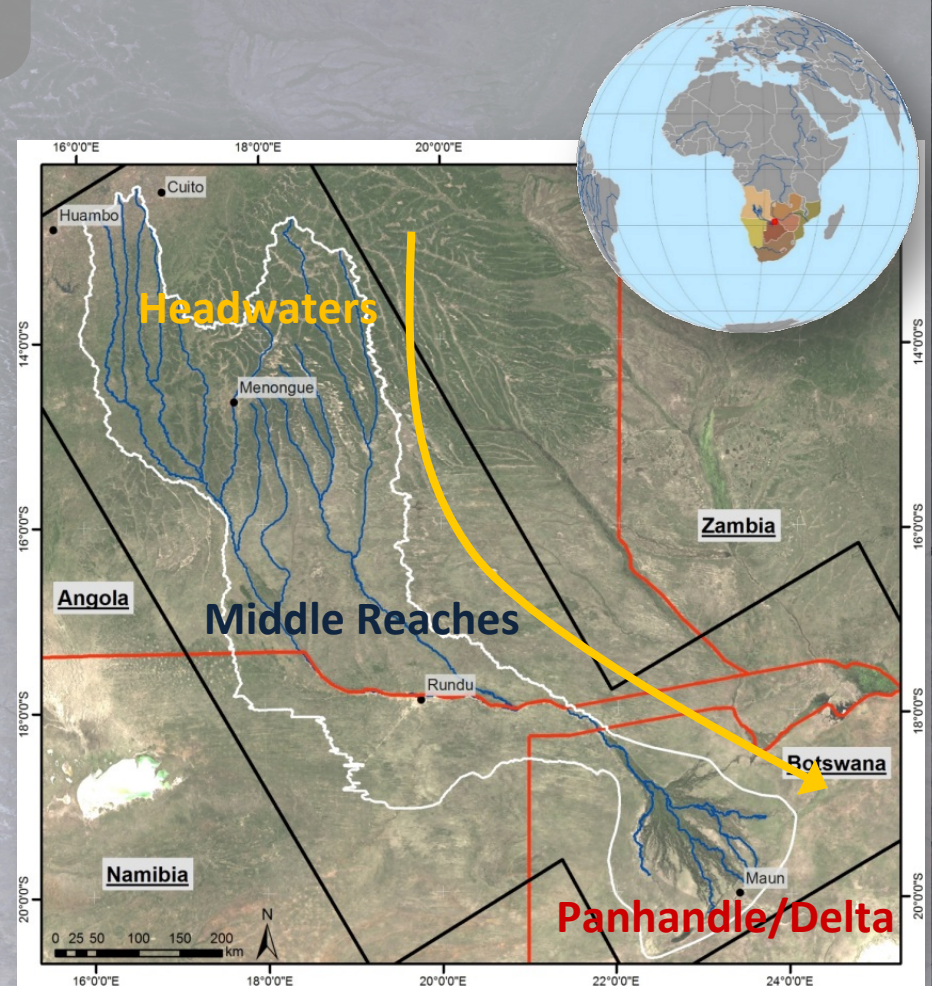


## The Future Okavango (TFO)

The Okavango catchment is a unique system of woodland savannas, floodplains and extended wetlands, and harbours an exceptional floral and faunal biodiversity

Okavango Catchment with its variety of savannah woodlands and wetland ecosystems is a potential hotspot of biodiversity loss and potential land use conflicts due to

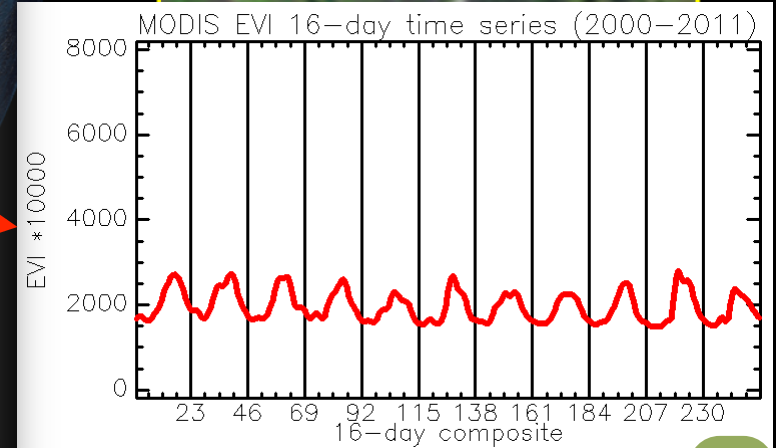
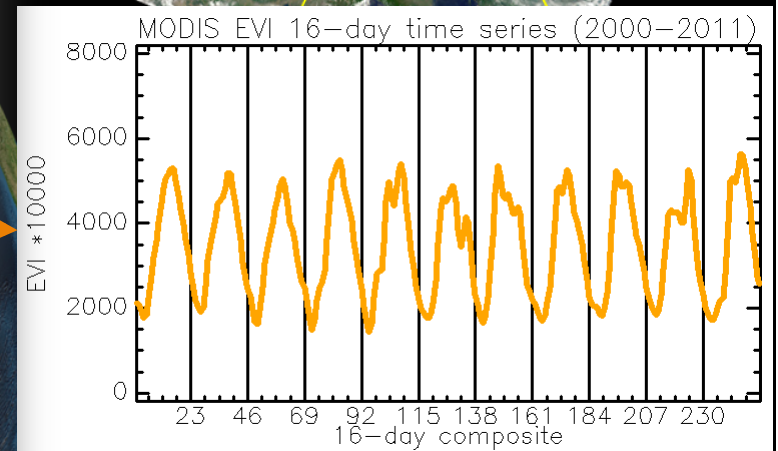
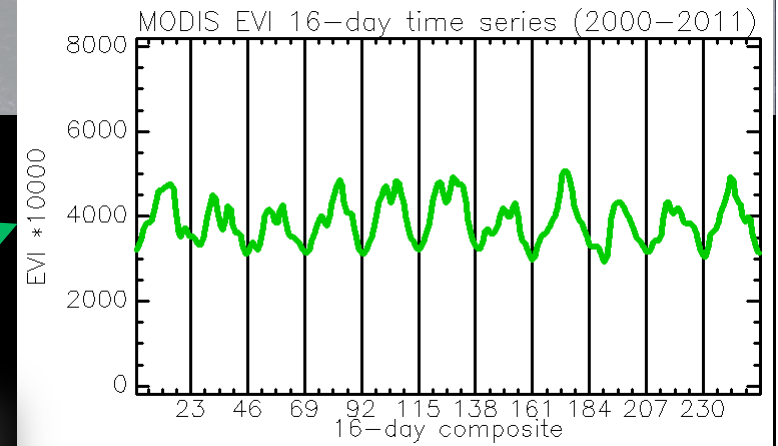
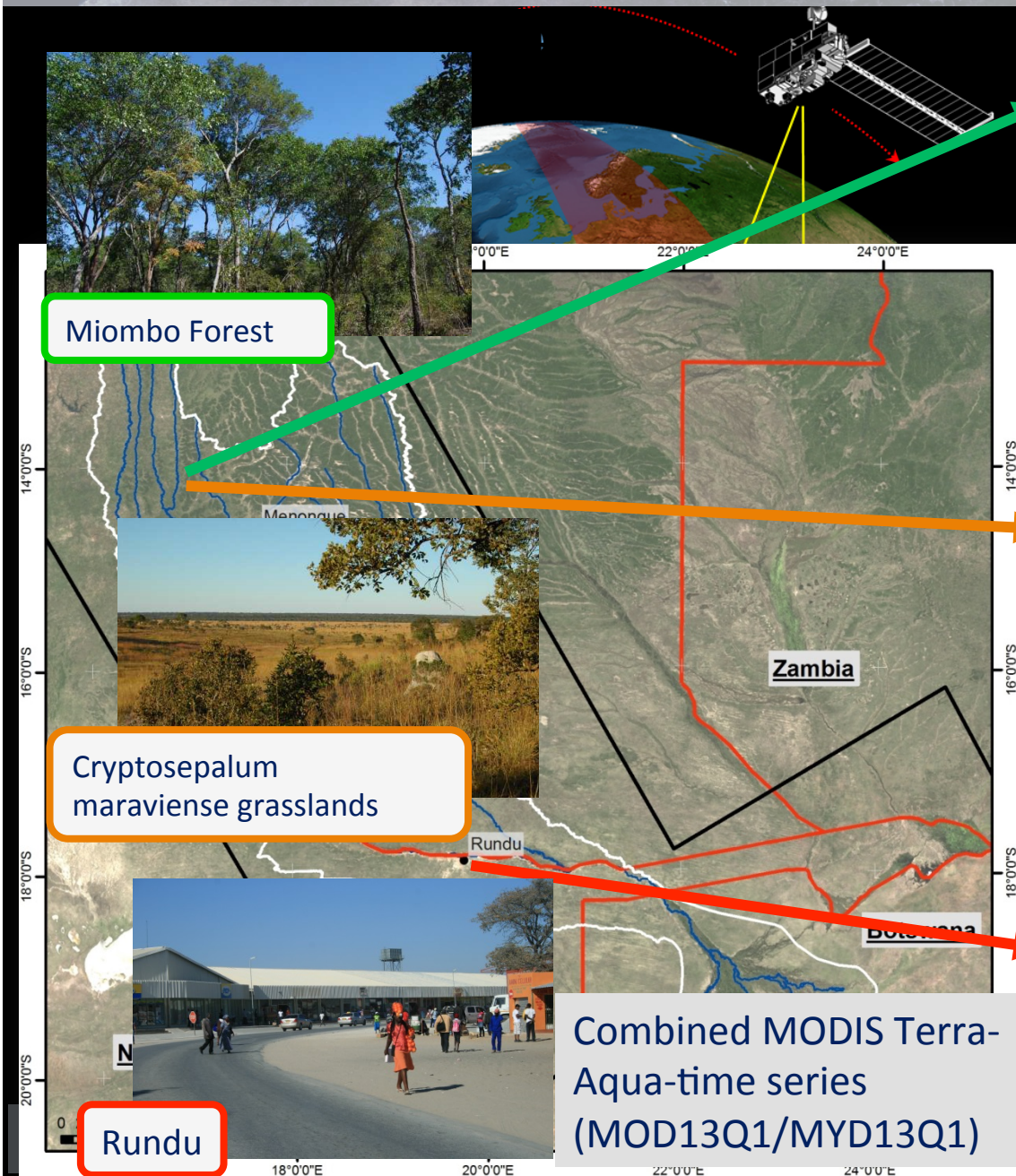
- climate change,
- population growth,
- anthropogenic over-utilization of natural resources.



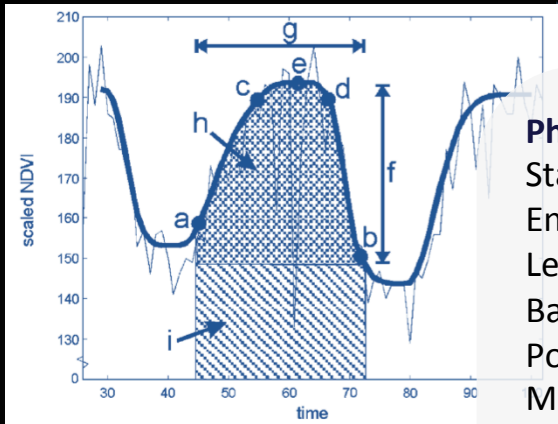
→ Assessment of resources, particularly their spatial distribution, variability and long-term behavior may support sustainable land use management plans

→ Monitoring of land cover and its changes based on earth observation data

# Land use /land cover and its dynamics



# Land use /land cover and its dynamics



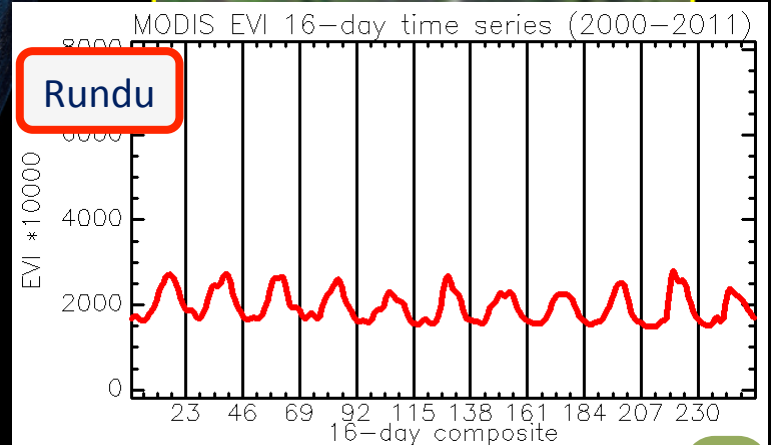
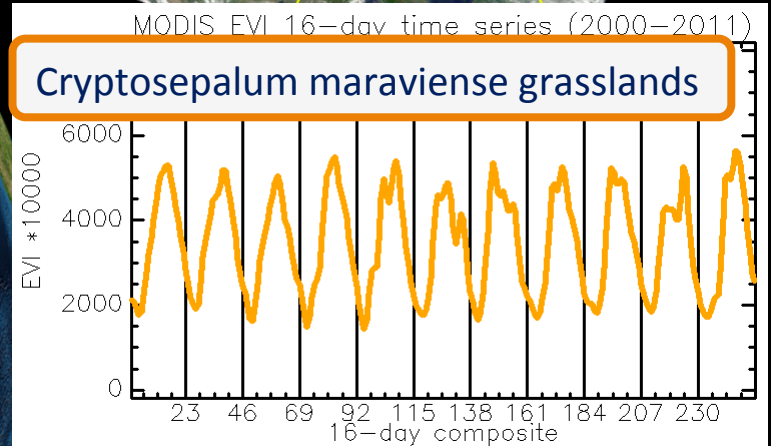
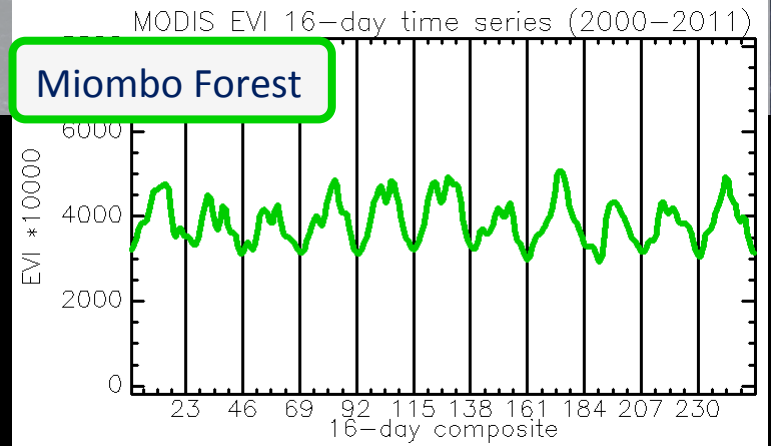
- Phenological descriptors**
- Start of season (a)
  - End of season (b)
  - Length of season (g)
  - Base value (b)
  - Position of middle of season (e)
  - Maximum of fitted data (e)
  - Amplitude (f)
  - Left derivative (a-c)
  - Right derivative (d-b)
  - Large/Total integral (i)
  - Small/Green integral (h)
  - Latent integral (i-h)

Jönsson & Eklundh 2002

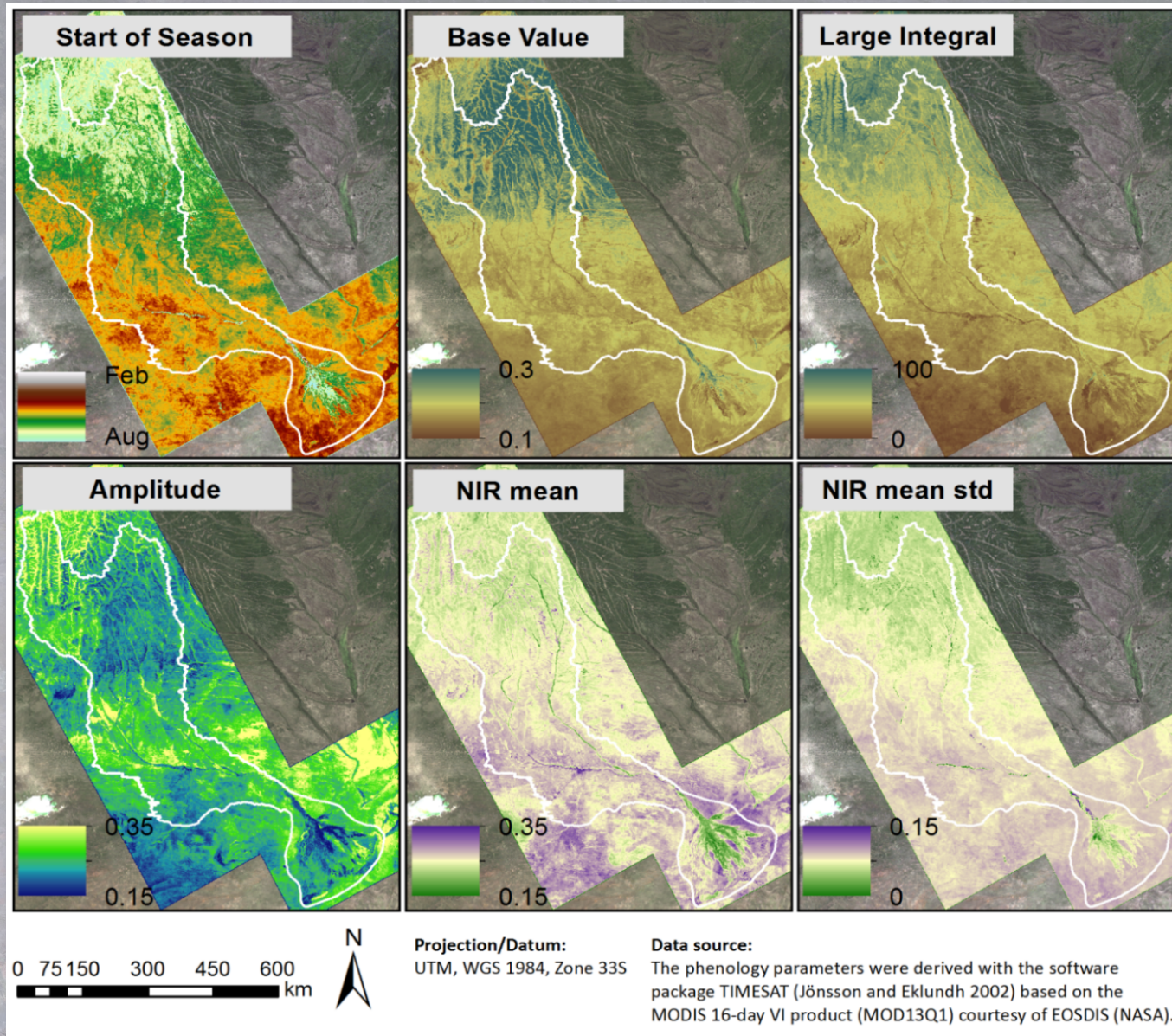
## MODIS(Terra/Aqua)-EVI time series (2000-2013)

→ phenological descriptors (TIMESAT, Jönsson & Eklundh 2002; SPLITS, Mader 2012) were derived and used

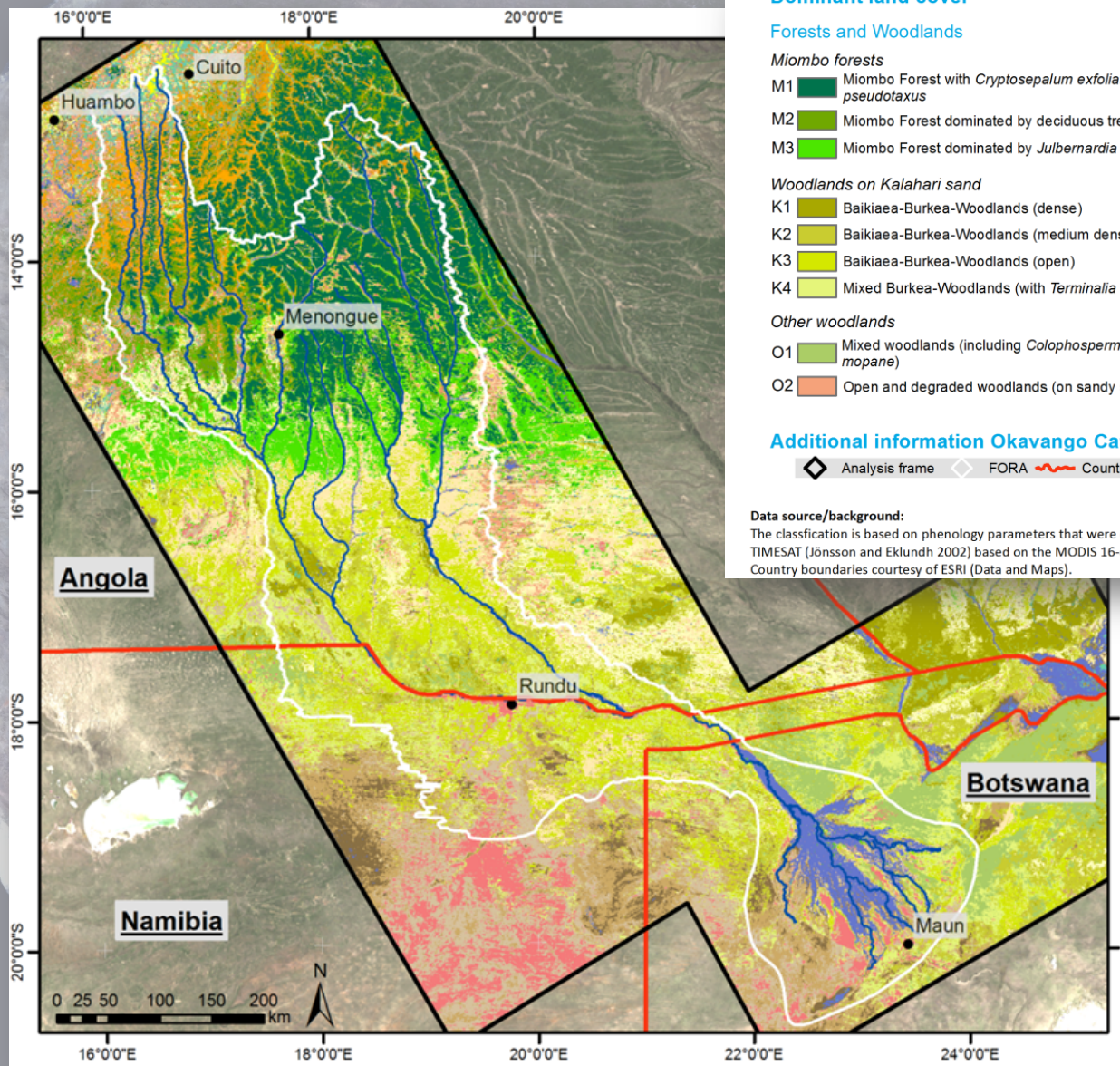
- 1) in an unsupervised classification approach to derive dominant, broad scale land cover types with typical seasonal profiles and
- 2) to map land cover changes.



# Land use /land cover and its dynamics



# Land use /land cover and its dynamics

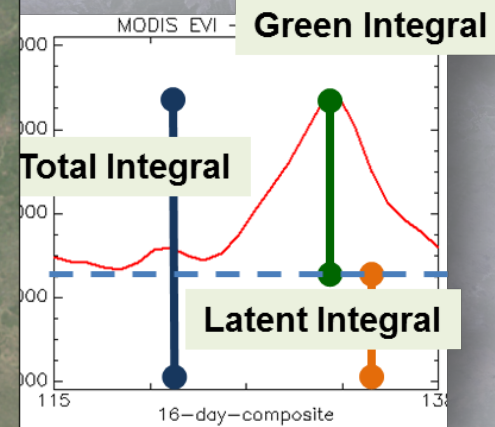
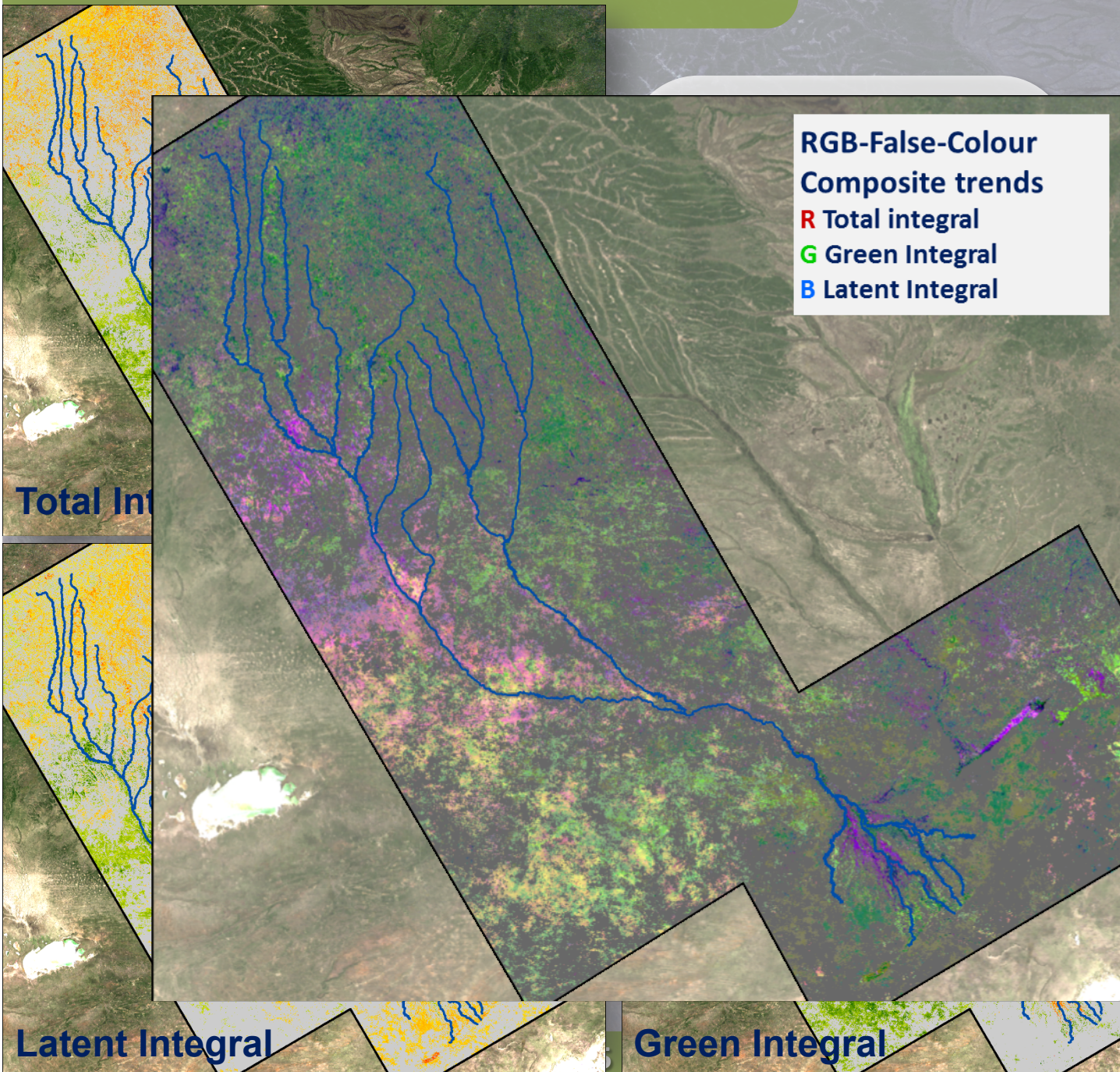


- Unsupervised classification (ISODATA) of mean phenology parameters
- Dominant land cover types were assigned by expert knowledge based on extensive vegetation sampling.

Dominant functional vegetation types

Stellmes et al. 2013

# Land use /land cover and its dynamics



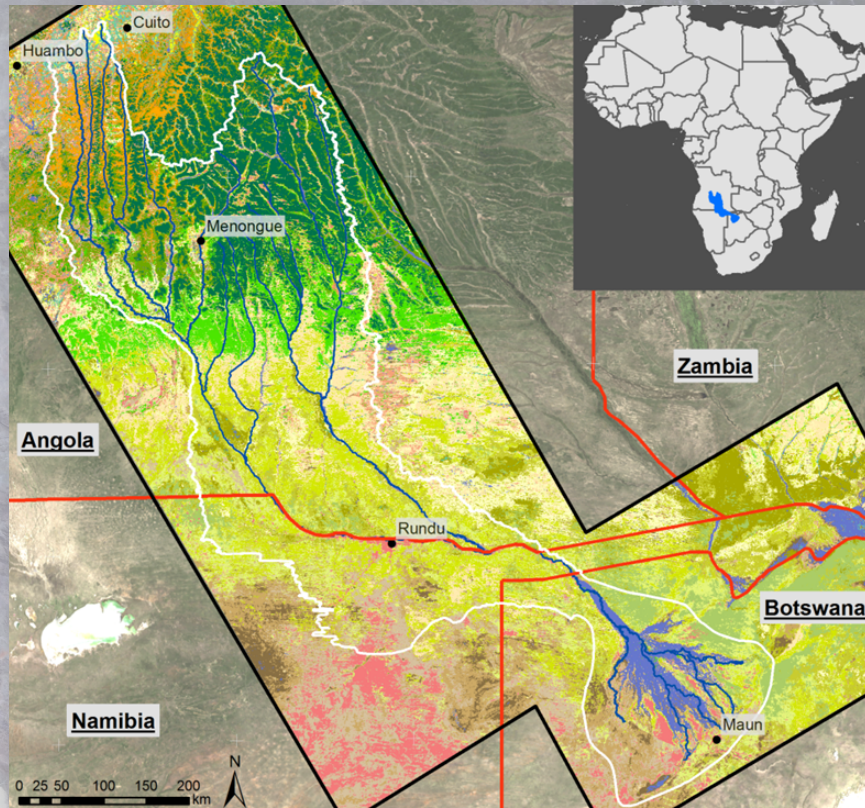
## Regr. coeff.



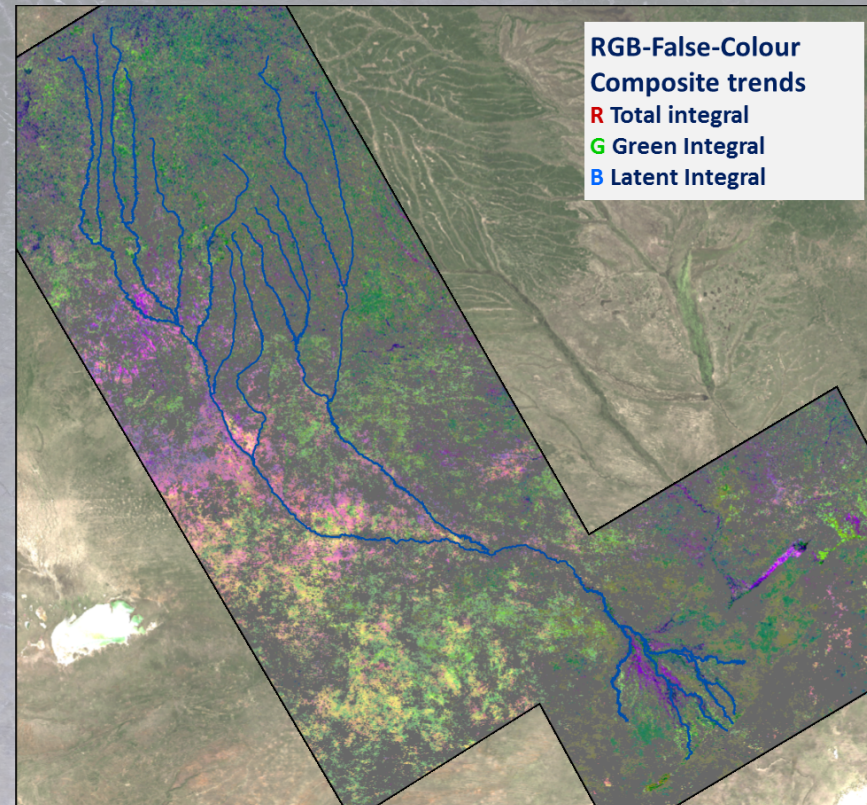
(alpha = 10%,  
grey = not sign.)

# Research Question

## Dominant land cover type



## Land cover changes (2000- 2014)



Linkage of the actual state and the observed trends to the underlying causes:  
What are the main drivers and how do they manifest themselves throughout the catchment?



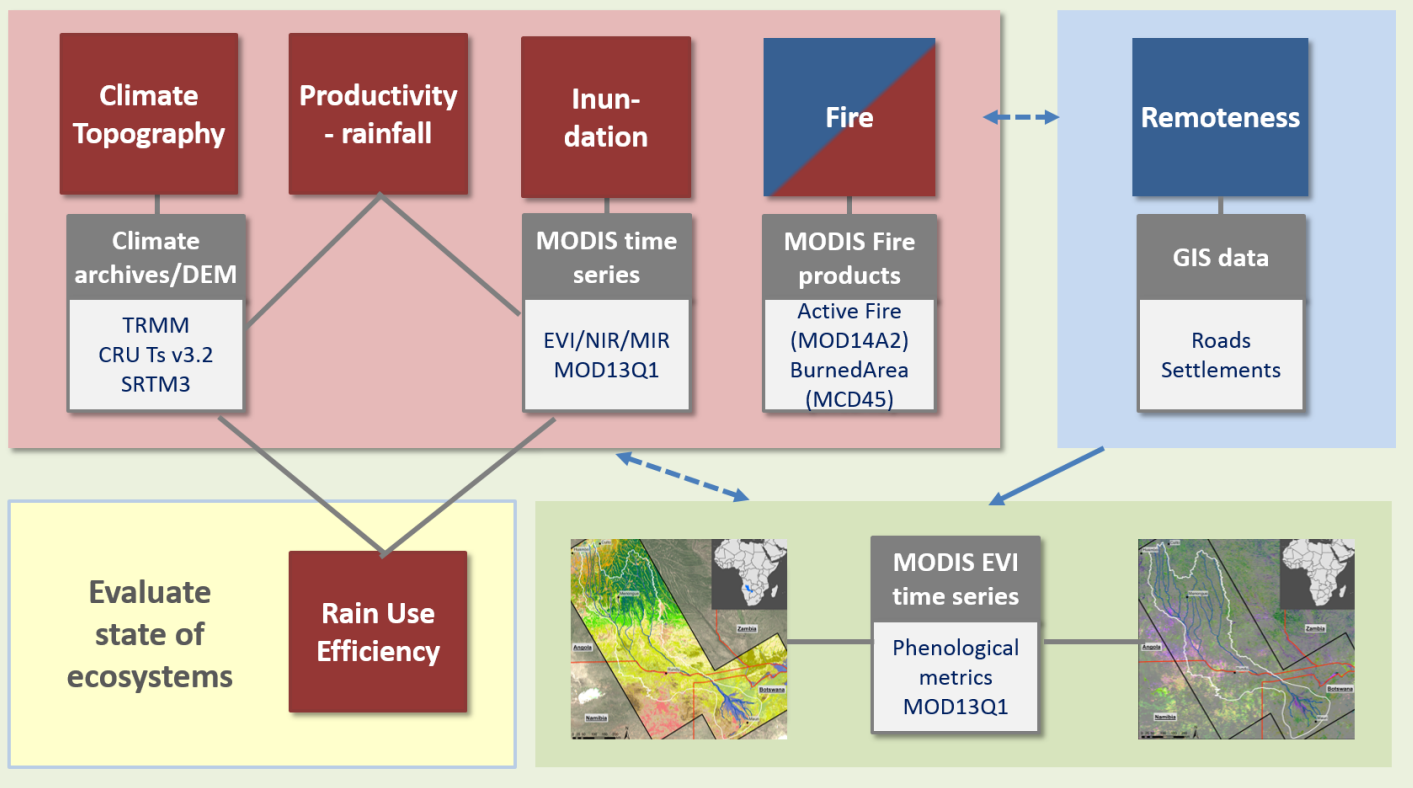
Linkage of the actual state and the observed trends to the underlying causes:  
What are the main drivers and how do they manifest themselves throughout the catchment?

## Drivers

Biophysical boundary conditions

Anthropogenic impact

## Dynamic variables



# Data

Linkage of  
What are the main

## Drivers

Biophysical

## Dynamic variables

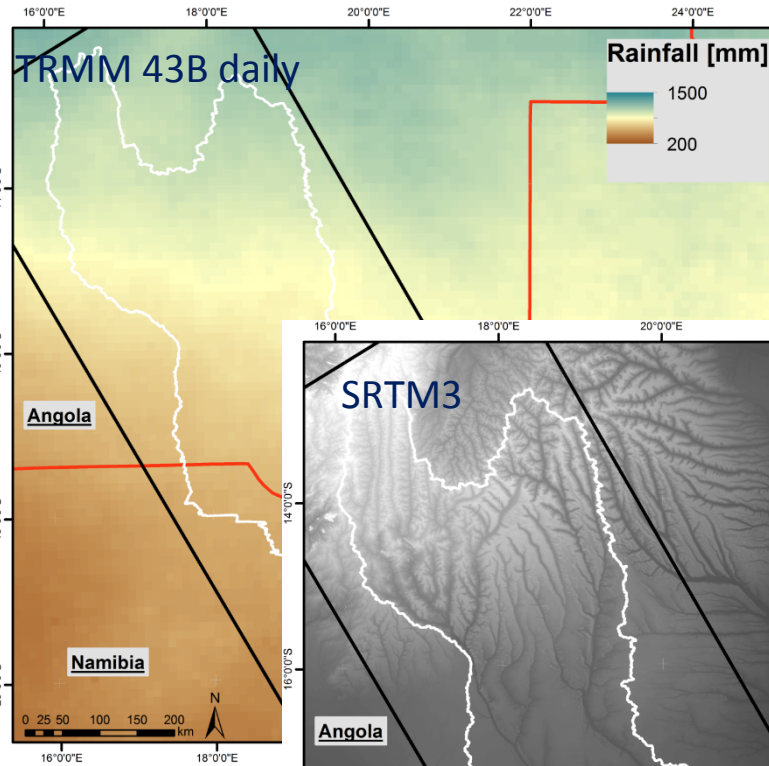
Climate  
Topography

Climate  
archives/DEM

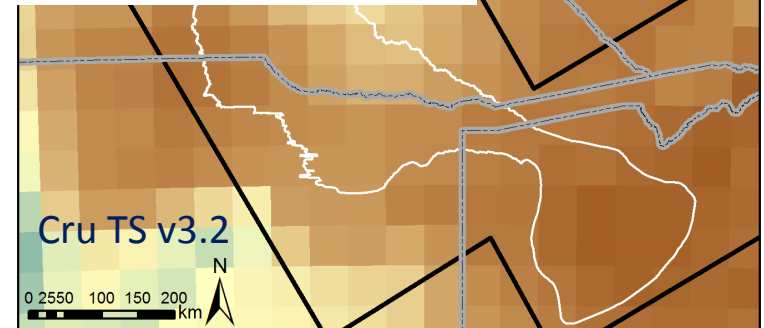
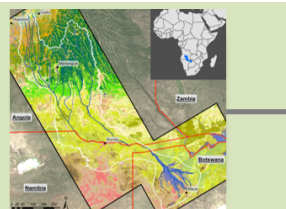
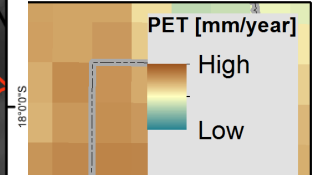
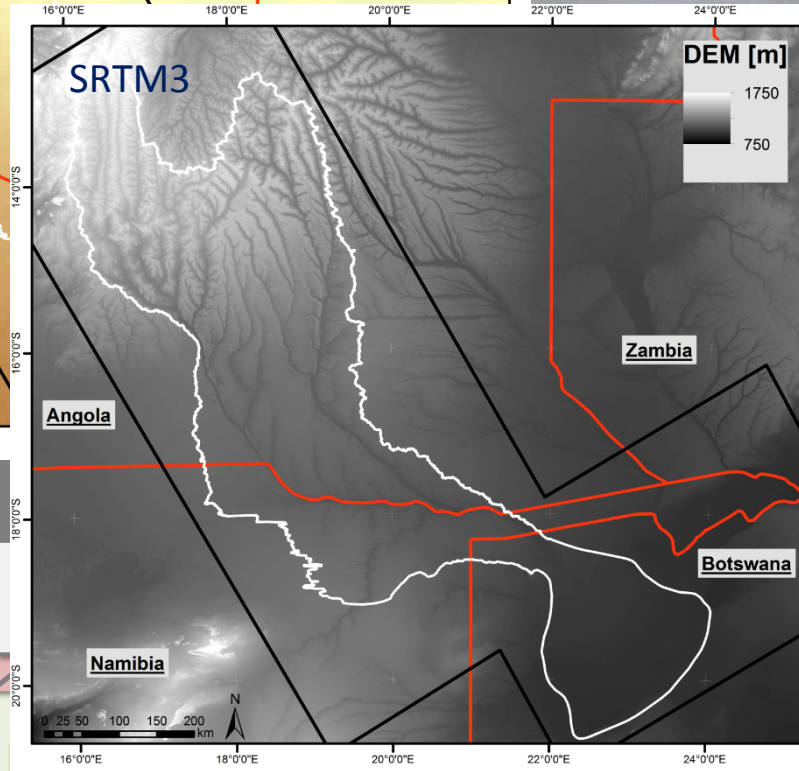
TRMM  
CRU Ts v3.2  
SRTM3

Evaluate  
state of  
ecosystems

Rain Use  
Efficiency



Underlying causes:  
throughout the catchment?

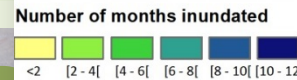
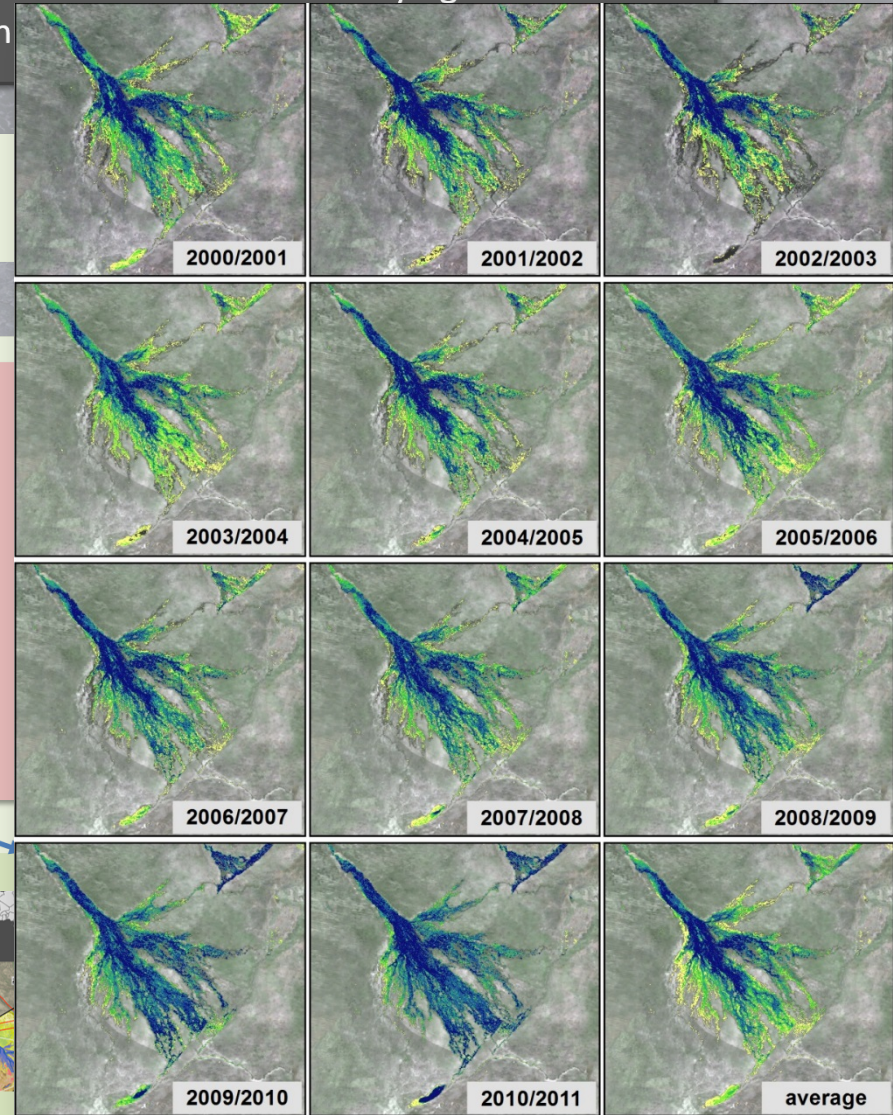
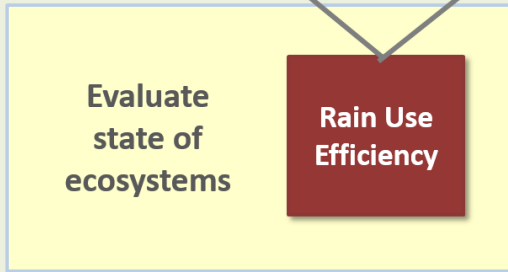
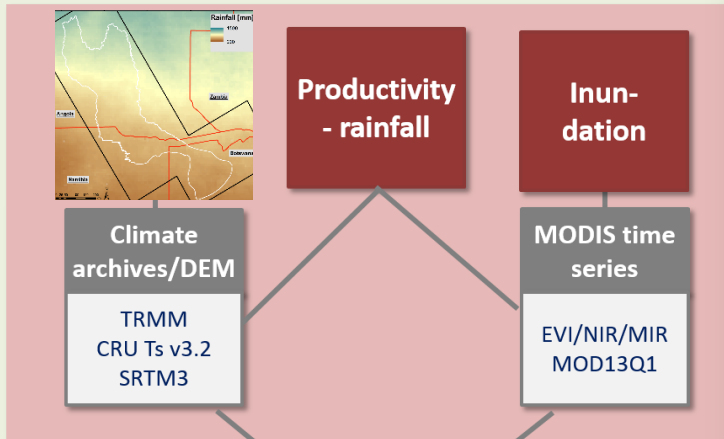


Linkage of the actual state and the observed trends to the underlying causes:  
 What are the main drivers and how do they man

Drivers

Biophysical boundary conditions

Dynamic variables



Data source/background:  
 MODIS imagery (MOD09A1) courtesy  
 of EOSDIS-NASA.  
 Projection/Datum:  
 UTM, WGS 1984, Zone 34S

Stellmes et al. 2013

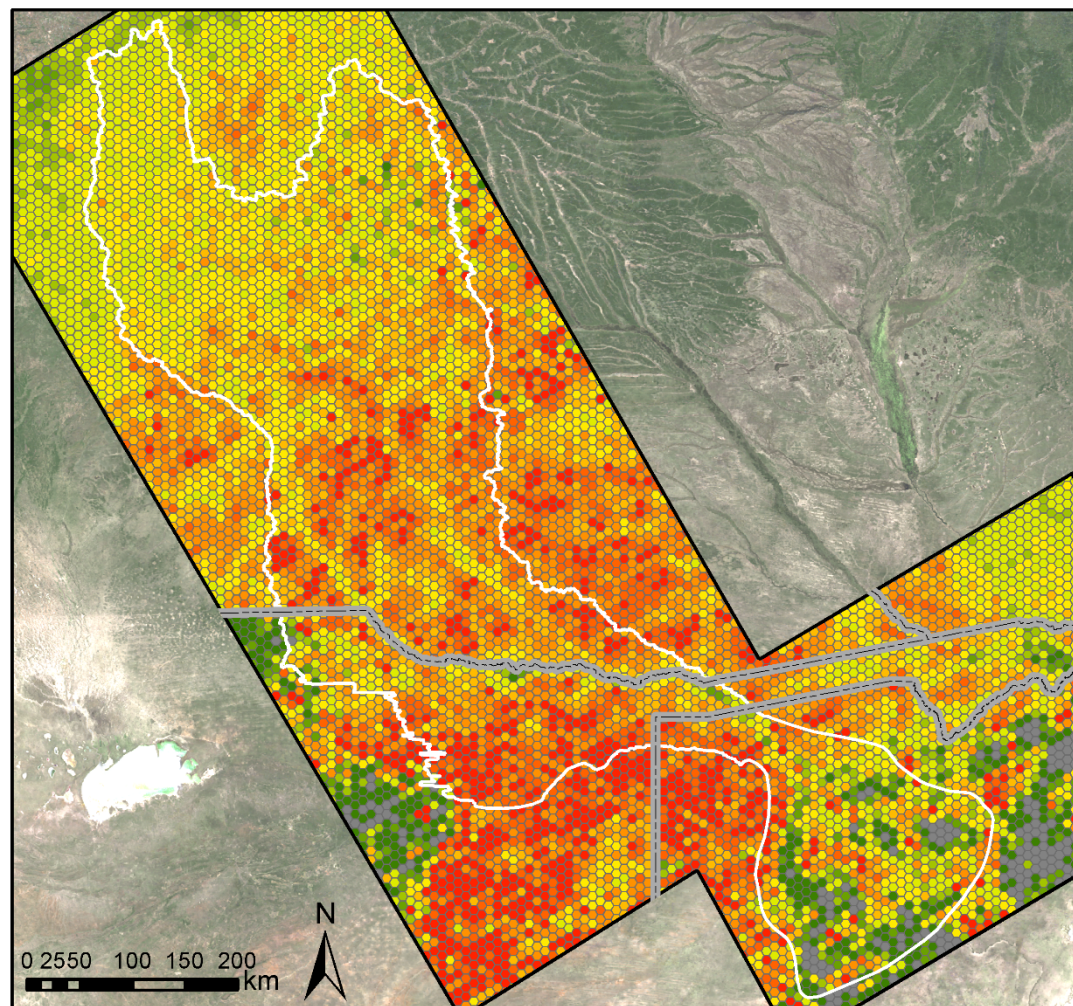
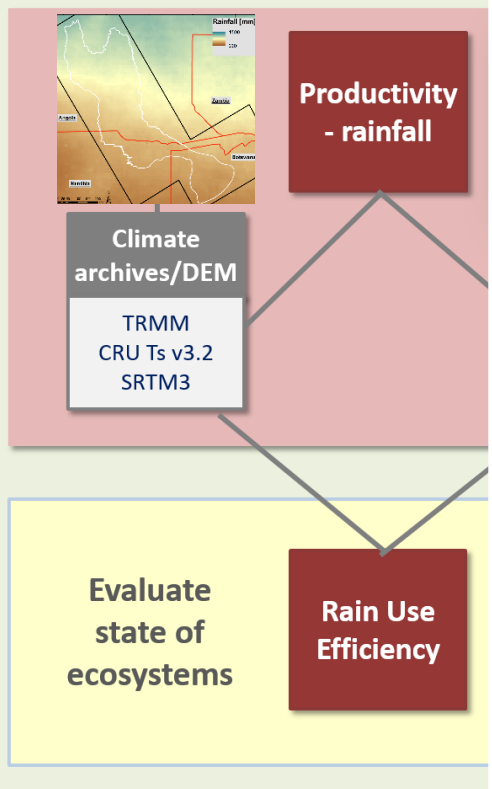
# Data

Linkage of the actual state  
What are the main drivers and h

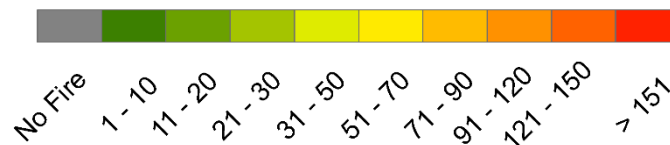
## Drivers

Biophysical boundary co

## Dynamic variables



Mean fire radiative power FRP [MW]



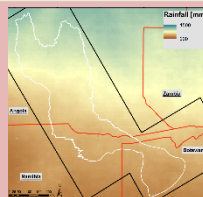
Stellmes et al. 2013 Frantz et al. In prep.

Linkage of the actual state  
What are the main drivers and ho

Drivers

Biophysical boundary co

Dynamic variables



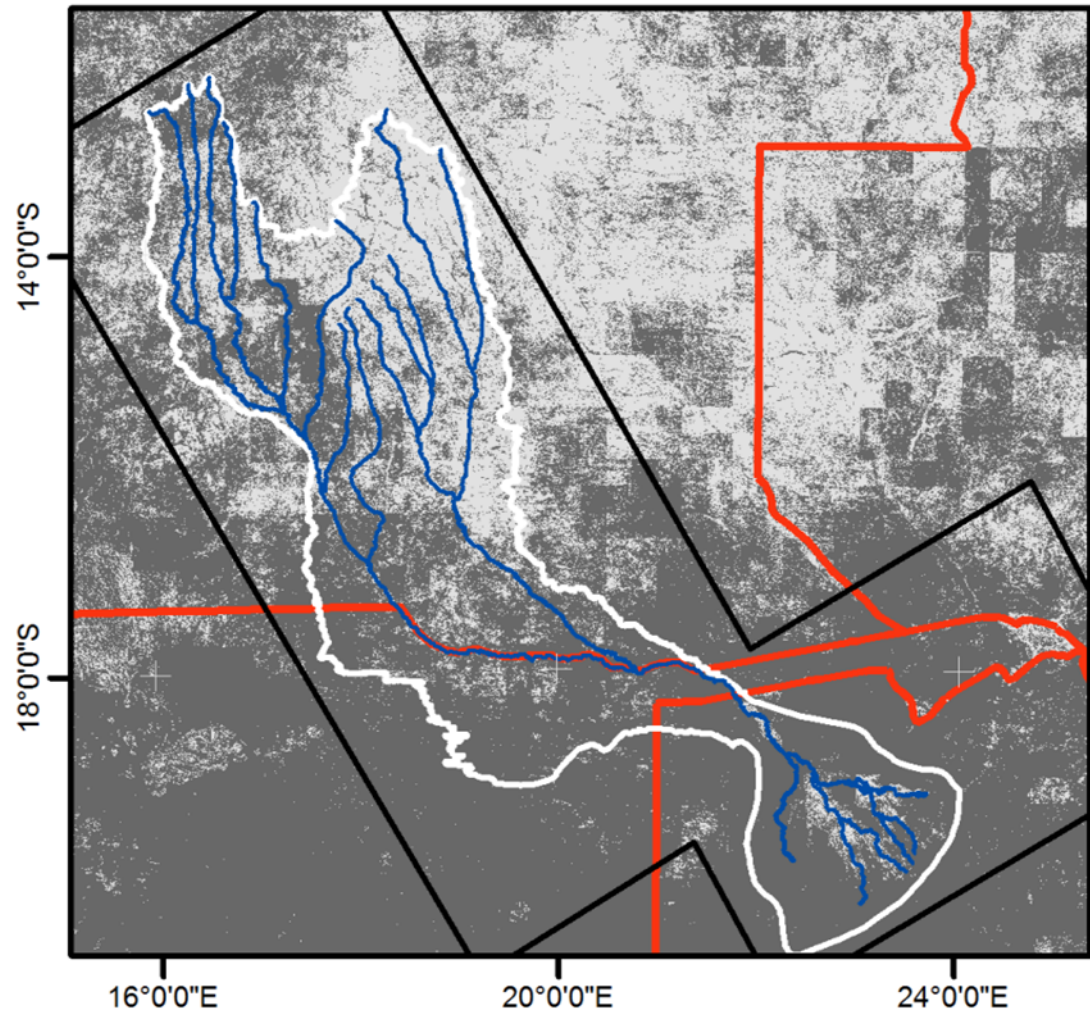
Productivity  
- rainfall

Climate  
archives/DEM

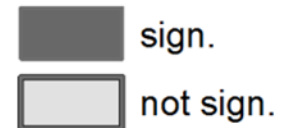
TRMM  
CRU Ts v3.2  
SRTM3

Evaluate  
state of  
ecosystems

Rain Use  
Efficiency



F-test (significance level 5%)



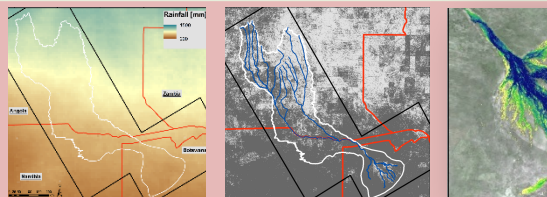
Udelhoven et al. 2015

Linkage of the actual state and the observed trends to the underlying causes:  
 What are the main drivers and how do they manifest themselves throughout the catchment?

## Drivers

Biophysical boundary condition

## Dynamic variables

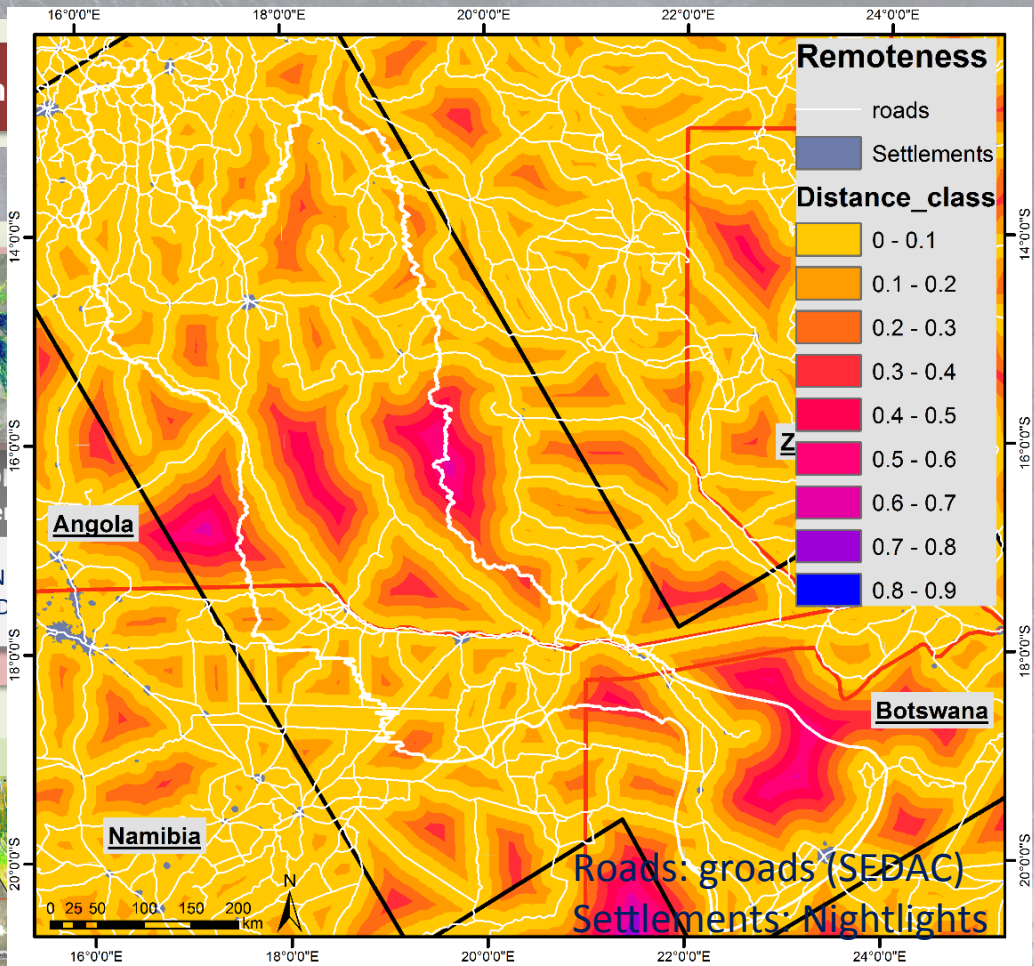


Climate archives/DEM  
 TRMM  
 CRU Ts v3.2  
 SRTM3

MODIS  
 EVI/NMODIS

Evaluate state of ecosystems

Rain Use Efficiency



### Additional information Okavango Catchment

- ◇ Analysis frame
- ◇ FORA
- ◇ Analysis frame
- Country boundaries
- Main rivers

# Combined Analyses

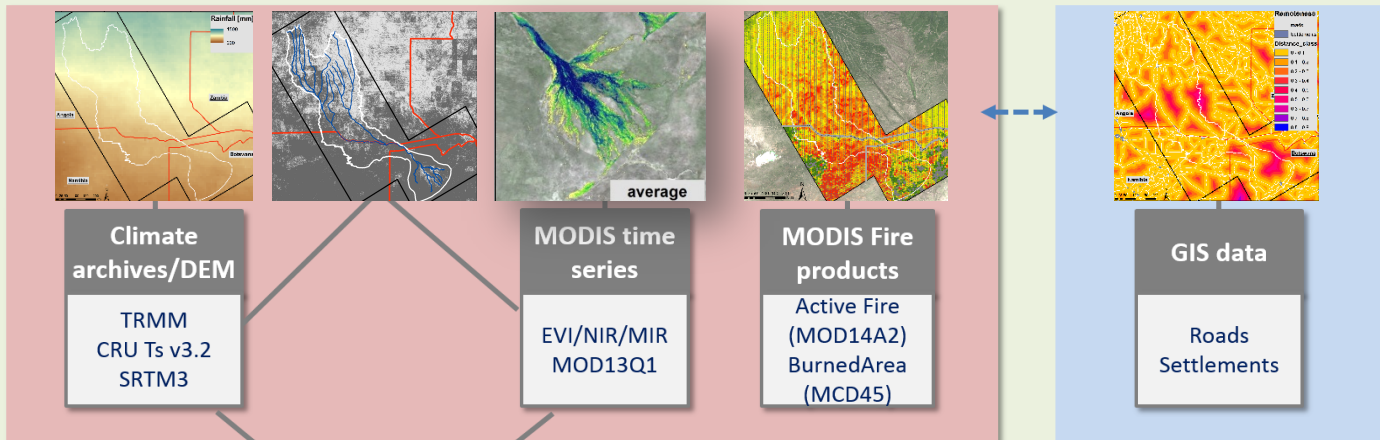
Linkage of the actual state and the observed trends to the underlying causes:  
 What are the main drivers and how do they manifest themselves throughout the catchment?

## Drivers

Biophysical boundary conditions

Anthropogenic impact

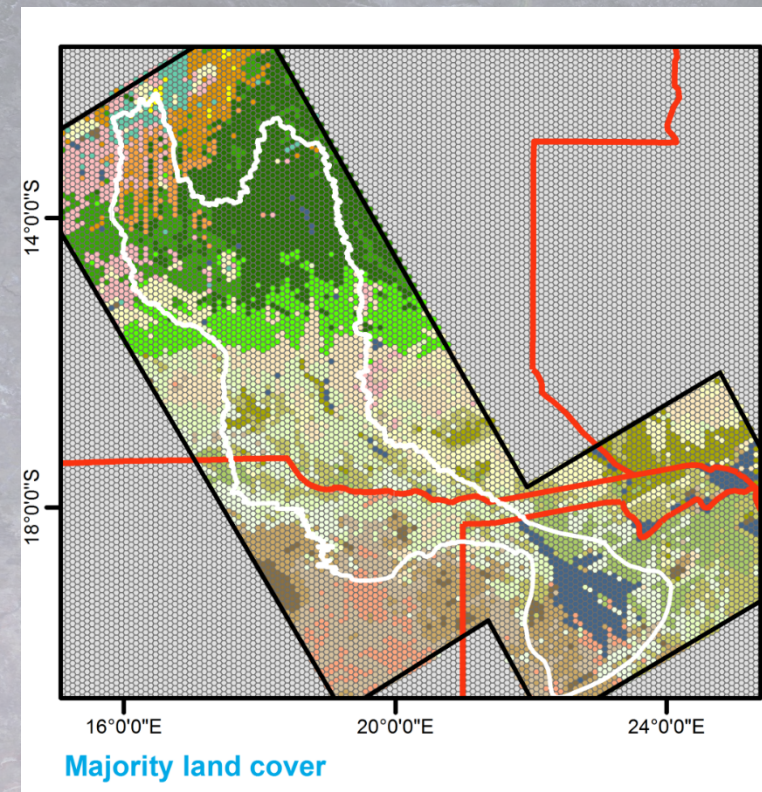
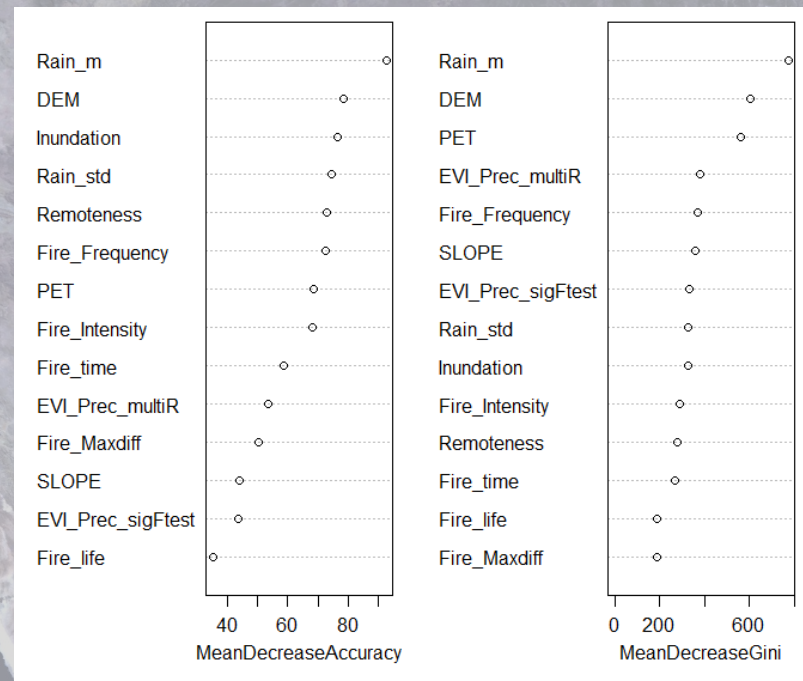
## Dynamic variables



Evaluation of typical landscape patterns and their properties by directly linking the single elements.

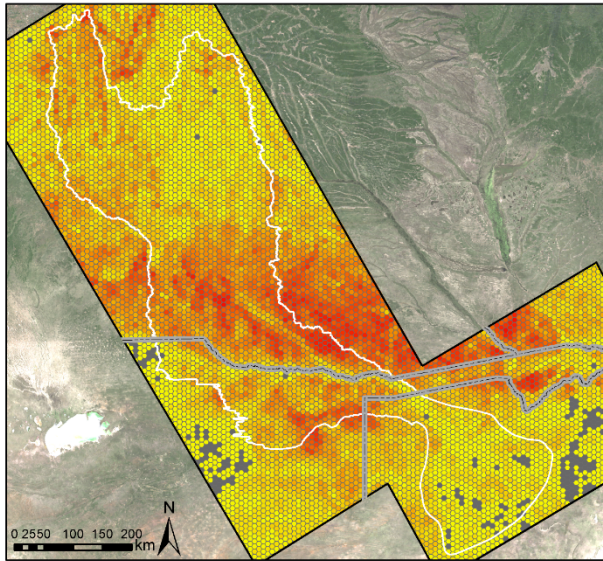
## Combined Analyses: Random Forest

- R package randomForest
- Model: landcover ~ climate, DEM, inundation, EVI-rainfall, fire, remoteness

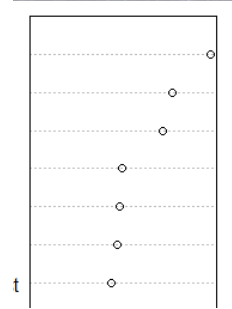
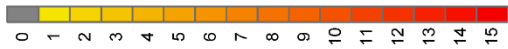




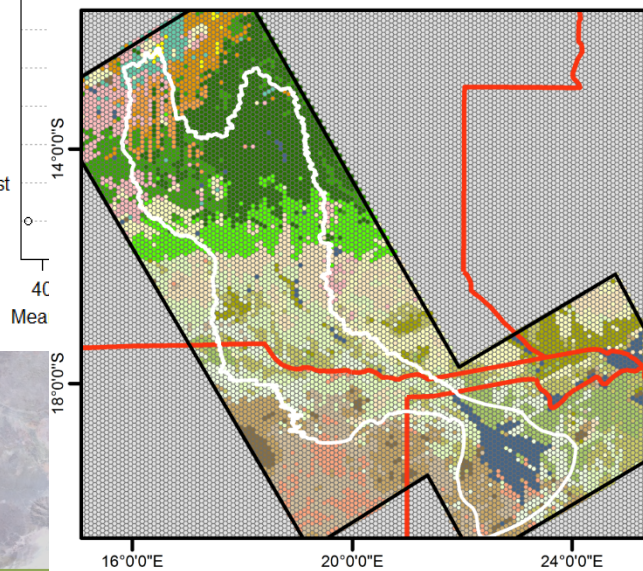
# Random Forest



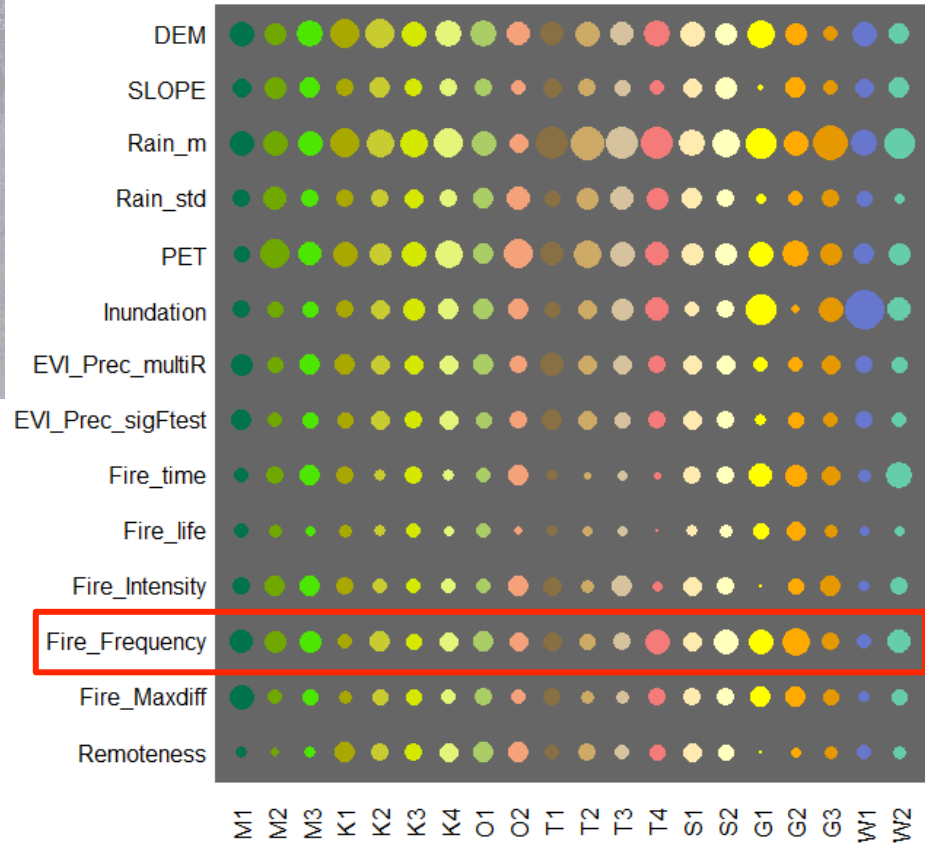
Number of years with detected fires (2000 - 2014)



- Fire\_Intensity
- Fire\_time
- EVI\_Prec\_multiR
- Fire\_Maxdiff
- SLOPE
- EVI\_Prec\_sigFtest
- Fire\_life



Majority land cover



# Random Forest

## Random Forest Confusion matrix

```
Call:
  randomForest(x = data[, c(2:9, 11:16)], y = as.factor(data[, 1]), replace = FALSE, import
    Type of random forest: classification
    Number of trees: 500
    No. of variables tried at each split: 3
```

OOB estimate of **error rate: 29.82%**

Confusion matrix:

	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	22	class.error
1	991	30	32	0	0	0	0	0	9	0	0	0	0	0	0	0	5	4	0	0	0.07469655
2	83	272	12	0	0	0	0	0	32	0	0	0	0	0	9	0	12	12	0	0	0.37037037
3	32	9	428	0	0	2	0	0	5	0	0	0	0	10	4	0	1	0	0	0	0.12830957
4	0	0	1	263	34	18	5	3	0	4	0	0	0	0	32	0	0	0	10	0	0.28918919
5	0	0	0	32	442	91	52	40	0	2	11	0	1	2	45	0	0	0	4	0	0.38781163
6	1	0	14	0	71	506	54	19	0	0	21	16	2	56	39	0	0	0	2	0	0.36828964
7	0	0	0	1	49	85	321	44	0	0	33	12	5	1	1	0	0	0	1	0	0.41952984
8	0	0	0	8	49	6	32	311	0	0	0	0	0	0	1	0	0	0	8	0	0.25060241
9	4	45	0	0	0	0	0	0	273	0	0	0	0	20	18	0	9	7	0	21	0.31234257
10	0	0	0	15	4	3	3	1	3	47	45	6	0	0	4	0	0	0	9	0	0.66428571
11	0	0	0	1	10	22	31	3	0	7	410	62	3	2	2	0	0	0	3	0	0.26258993
12	0	0	0	0	4	32	25	2	1	1	86	368	47	3	4	0	0	0	2	0	0.36000000
13	1	0	0	0	5	3	9	2	0	0	11	93	136	2	0	0	0	0	6	0	0.49253731
14	1	1	35	1	3	84	0	2	12	0	4	2	0	376	50	0	0	0	4	0	0.34608696
15	0	18	23	40	19	21	0	7	18	0	1	0	0	50	412	0	2	7	1	4	0.33868379
16	0	0	0	0	0	0	0	0	1	0	0	0	0	0	0	12	0	4	0	6	0.47826087
17	5	9	0	0	0	0	0	0	12	0	0	0	0	0	0	1	100	6	0	4	0.27007299
18	19	15	0	0	0	0	0	0	27	0	0	0	0	0	1	0	9	162	0	4	0.31645570
19	6	3	1	5	2	2	0	0	6	1	2	0	1	4	2	0	0	0	299	0	0.10479042
22	4	1	0	0	0	0	0	0	29	0	0	0	0	0	3	4	3	10	0	97	0.35761589

Miombo

Baieka-  
Burkea

Other  
woodlands

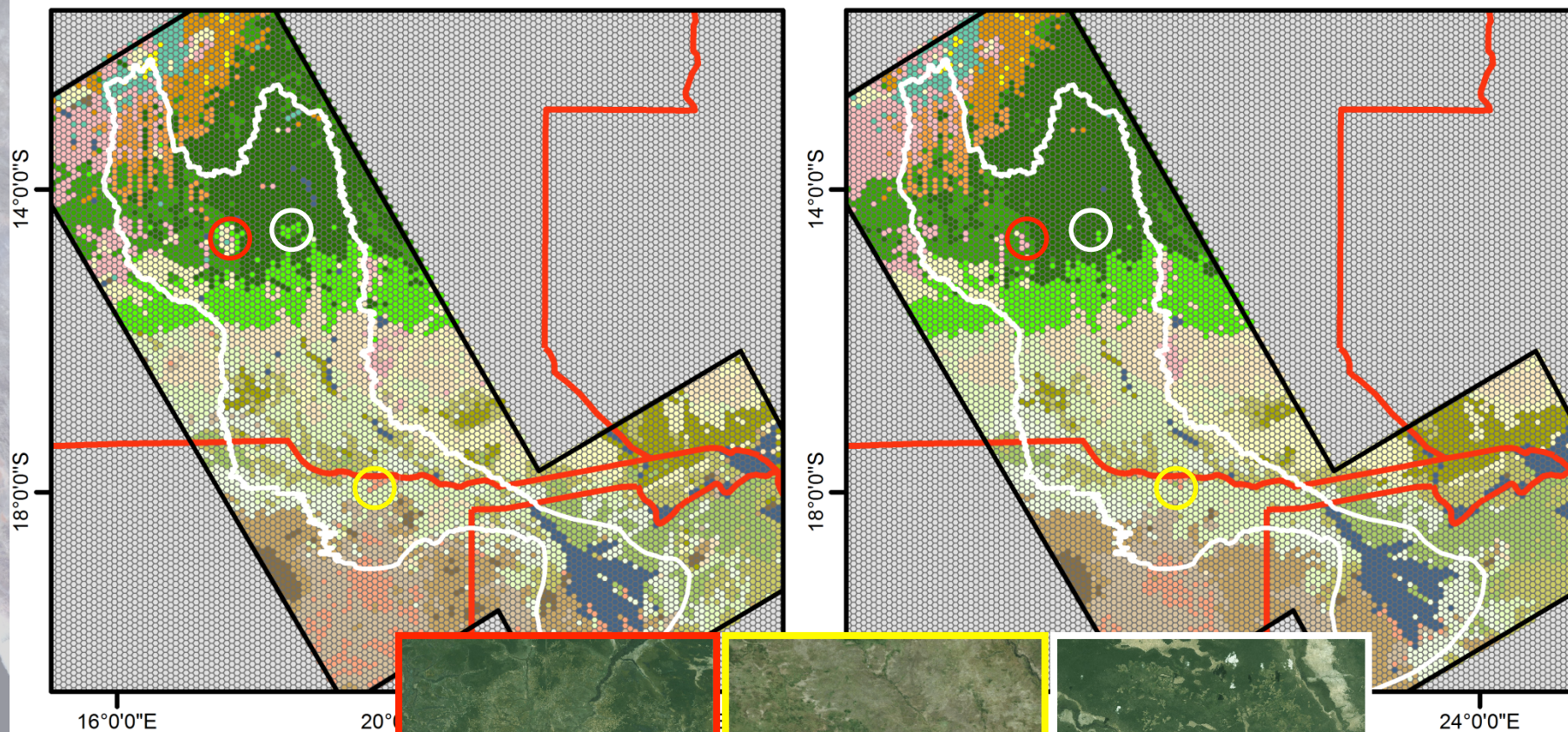
Savannah

Shrub-  
lands

Grass-  
lands

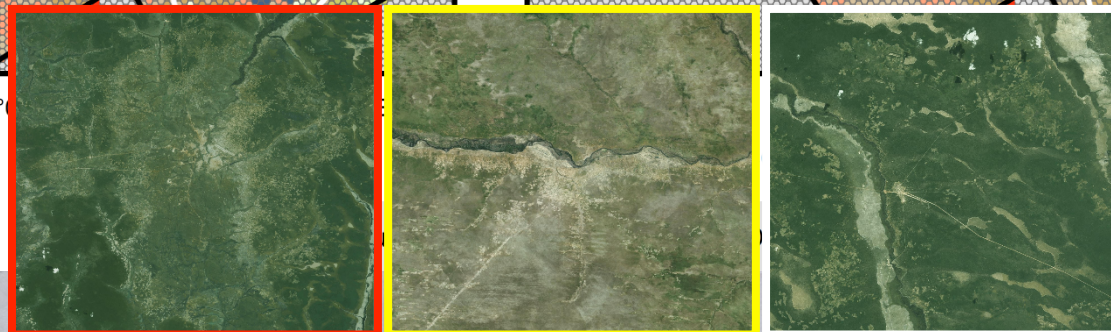
Wetlands

# Combined Analyses: Random Forest



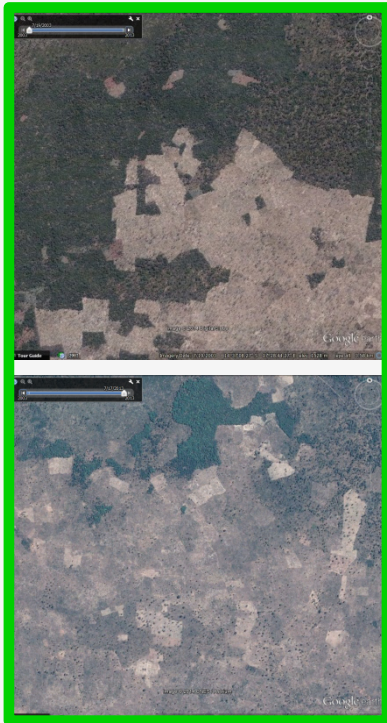
Majority land cover

Additional information



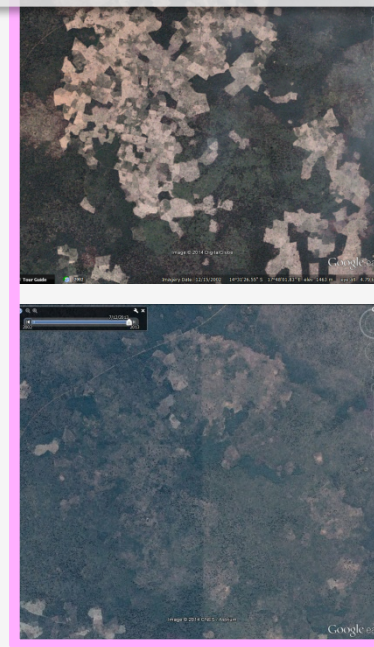
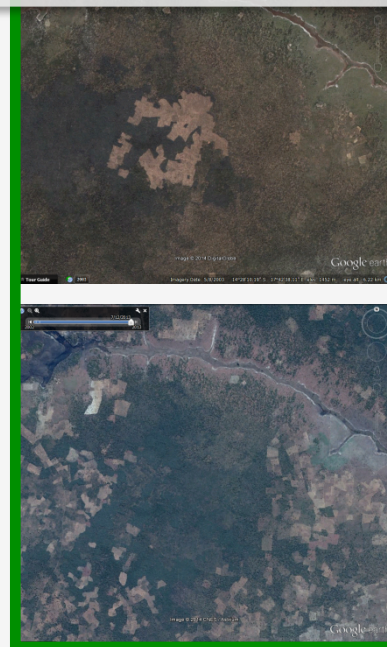
me

# Example: Wider area Menongue



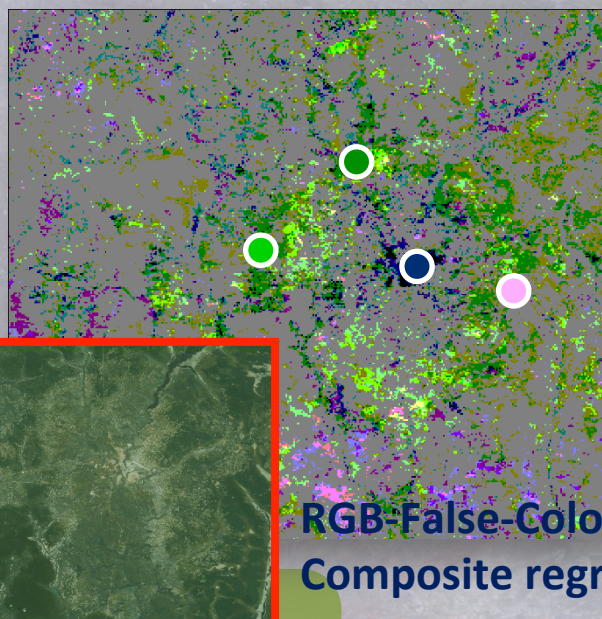
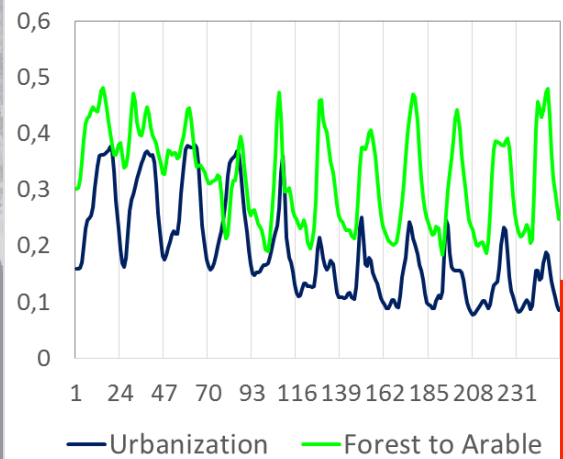
2003

2013



## EVI time series

(16day-composites, 2000-2012)

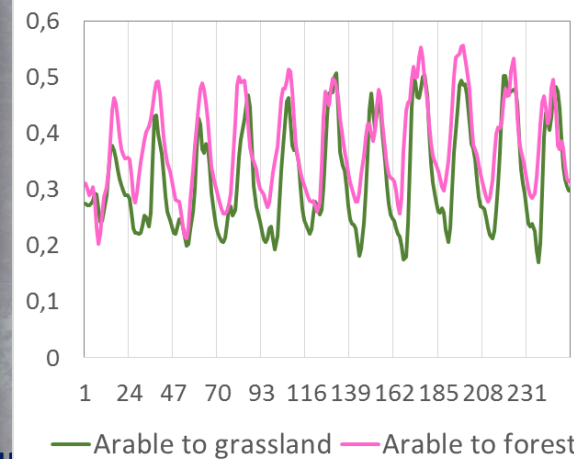


RGB-False-Colour

Composite regression coefficients

## EVI time series

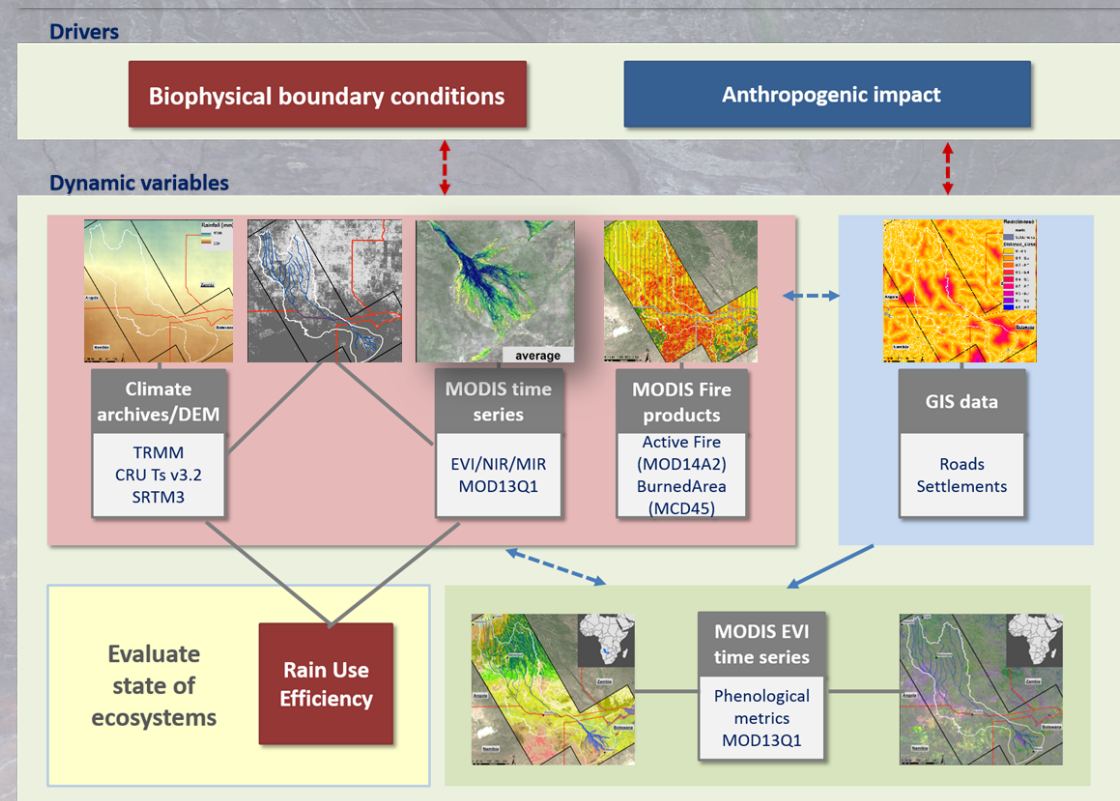
(16day-composites, 2000-2012)



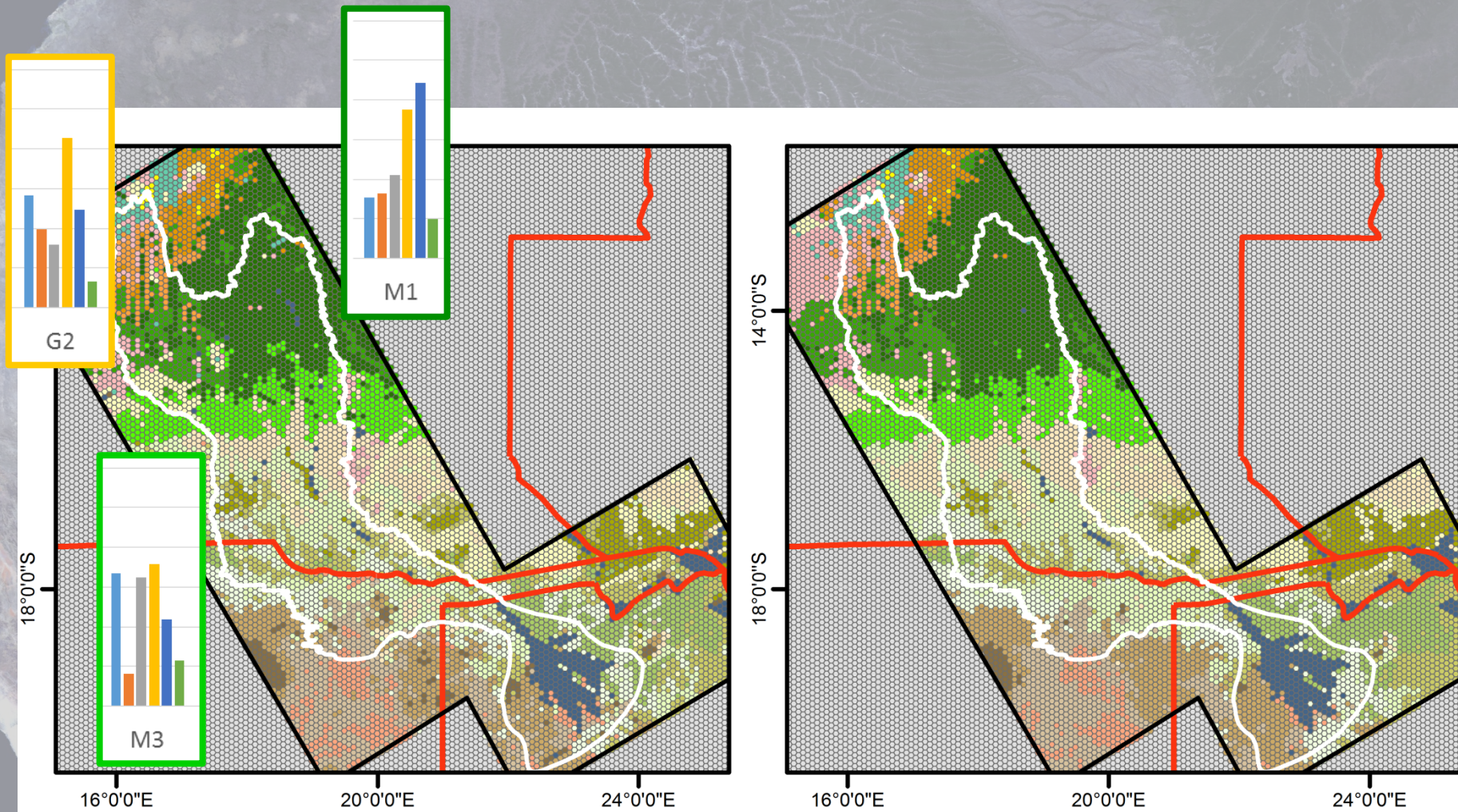
## Summary and Outlook

- Important variables describing the ecosystems of the Okavango Catchment were derived and have to be further analysed regarding their patterns and inter-relationships
- Land cover was explained to a high degree by derived variables, nevertheless important variables may miss (e.g. soil information)

- Observed land cover dynamics will be analysed concerning the biophysical boundary conditions to distinguish land use change and “normal” variability.
- Mapping of typical land system patterns including their dynamics and underlying drivers
- Rain use efficiency as an indicator for ecosystem status



# Combined Analyses: Random Forest



Majority land cover

Predicted landcover

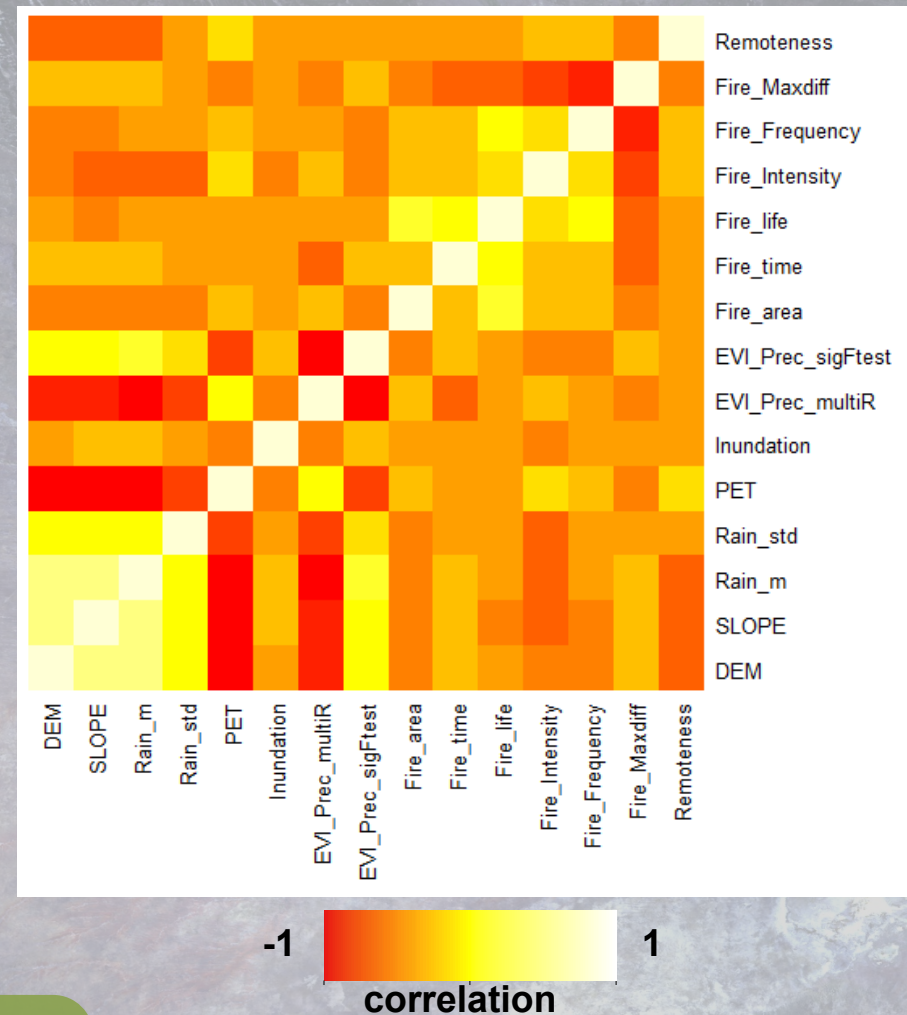
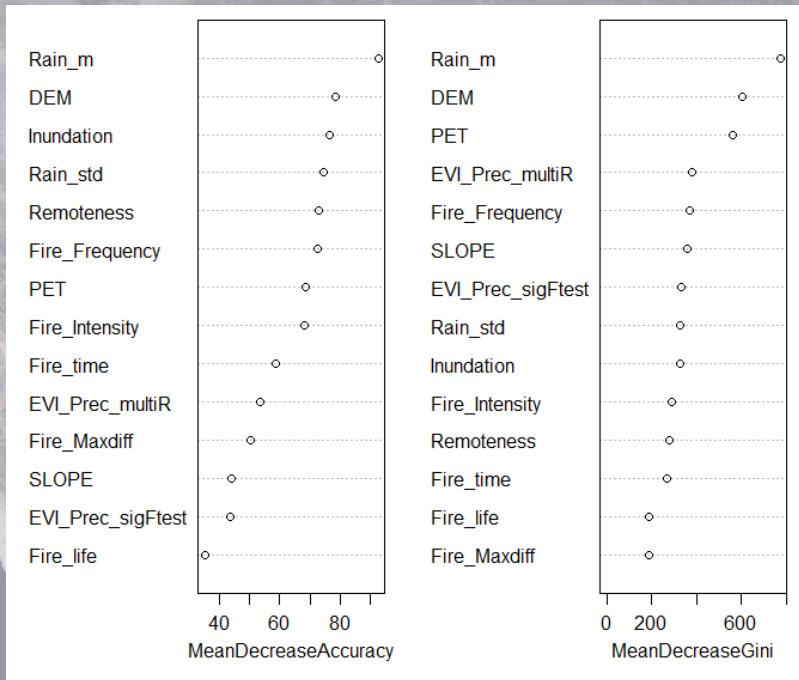
Additional information

- Country boundaries
- FORA
- Analysis frame

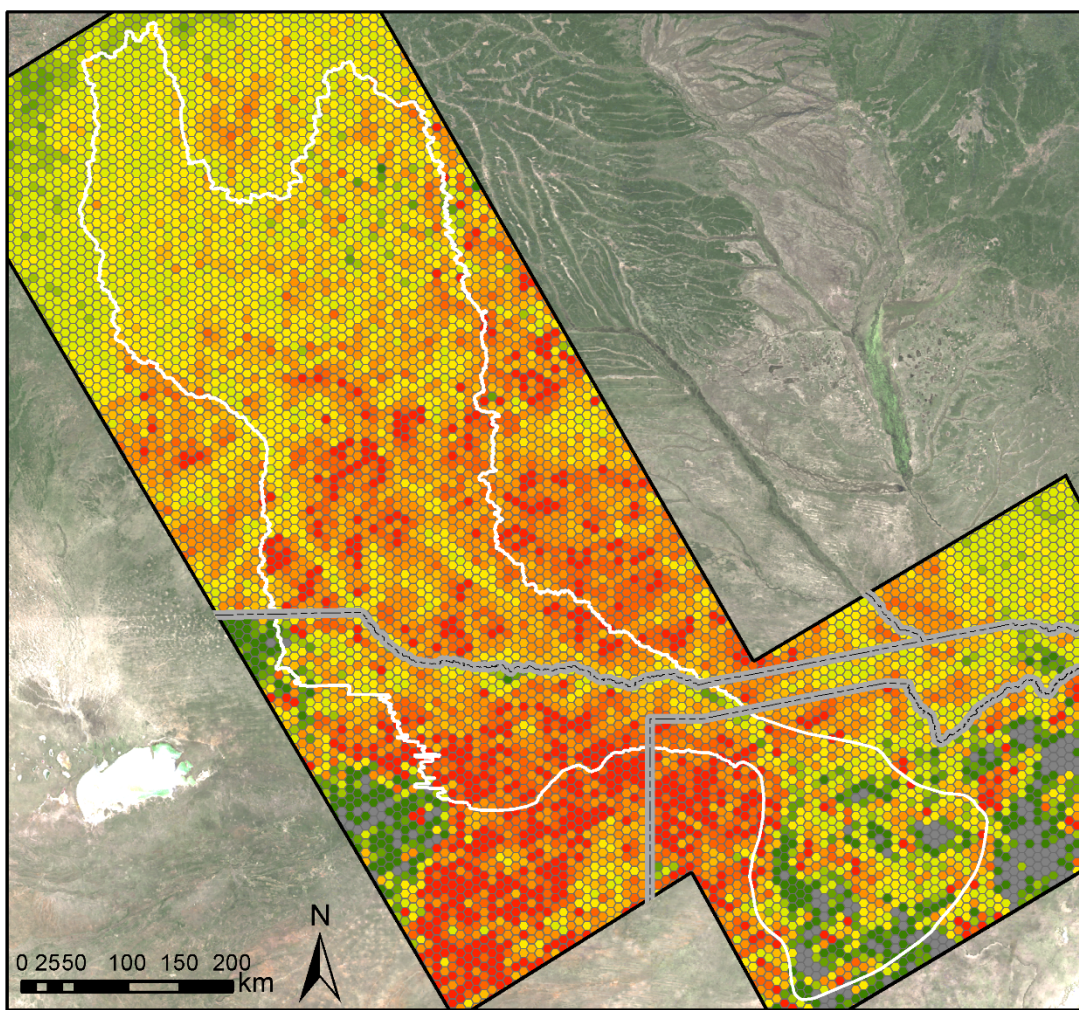
- Fire\_time
- Fire\_life
- Fire\_Intensity
- Fire\_Frequency
- Fire\_Maxdiff
- Remoteness

# Combined Analyses: Random Forest

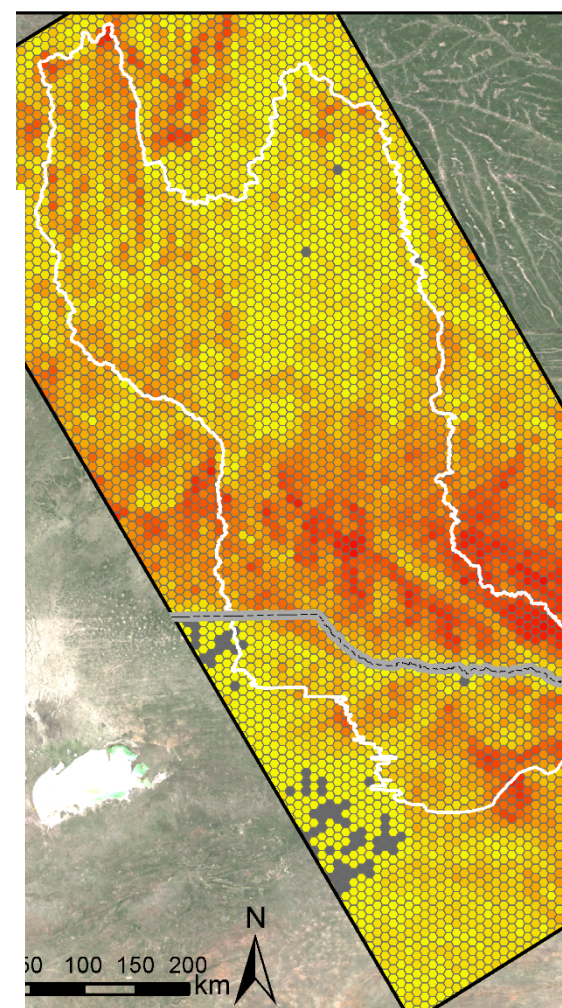
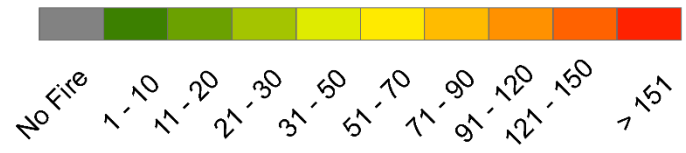
- R package randomForest
- Model: landcover ~ climate, DEM, inundation, EVI-rainfall, fire, remoteness



Date



Mean fire radiative power FRP [MW]



Number of years with detected fires (2000)



Stellmes et al. 2013 Frantz et al. In prep

MultiTemp

