

# Where are the Missing Burned Areas?

## Global Hotspots of Burned Area - A Multiresolution Analysis

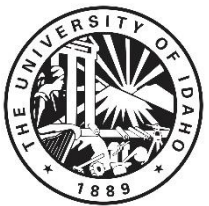
David Roy <sup>a, b</sup>, Haiyan Huang <sup>a</sup>, Luigi Boschetti <sup>c</sup>, Hugo De Lemos <sup>a</sup>, Louis Giglio <sup>d</sup>

<sup>a</sup> Center for Global Change and Earth Observations (CGCEO), Michigan State University

<sup>b</sup> Department of Geography, Environment, and Spatial Sciences, Michigan State University

<sup>c</sup> College of Natural Resources, University of Idaho

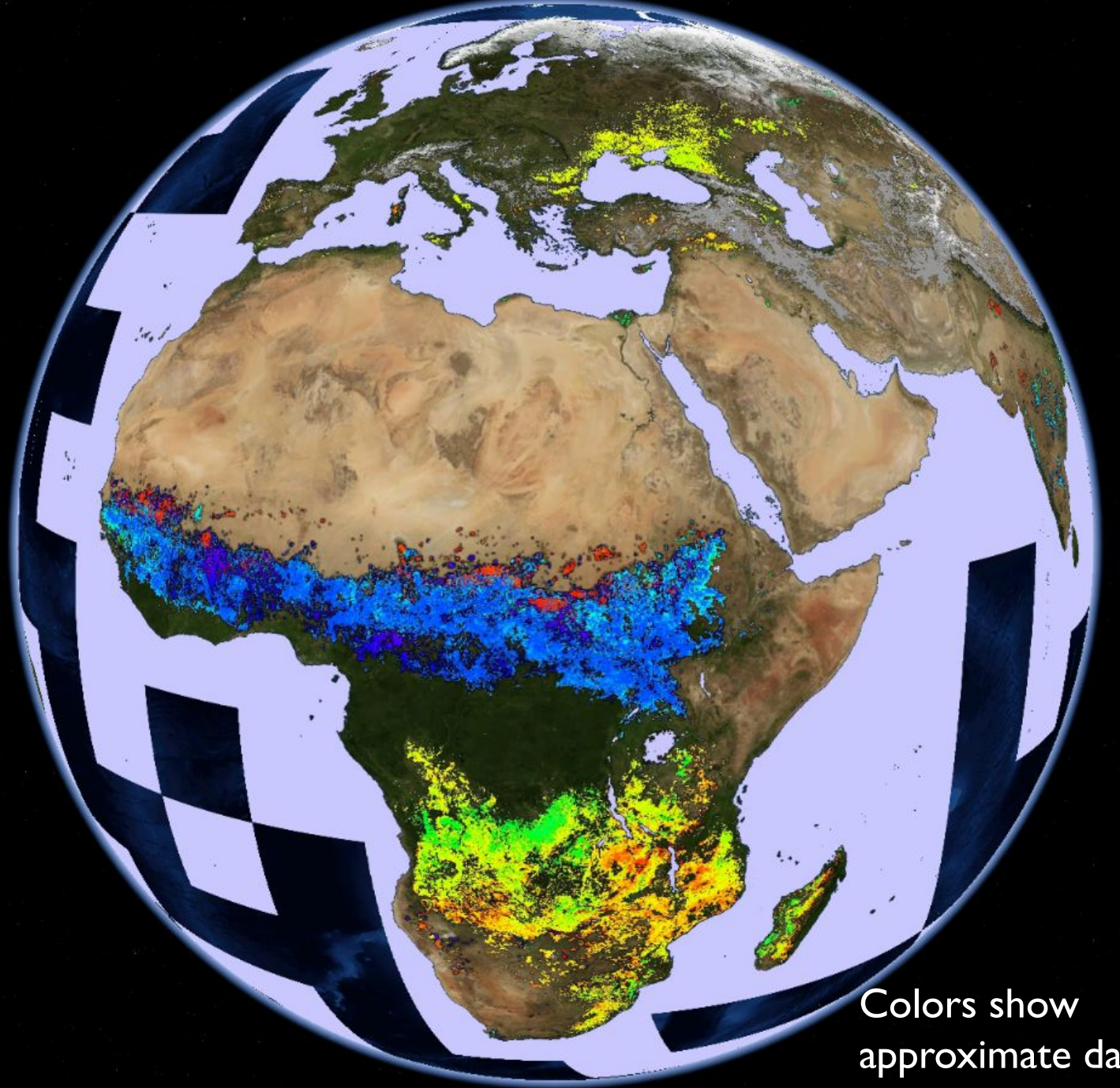
<sup>d</sup> Department of Geographical Sciences, University of Maryland, College Park



# The definitive global burned area record:

NASA MODIS 500m  
burned area product

Giglio, Boschetti, Roy, Humber,  
Justice, 2018, *RSE*

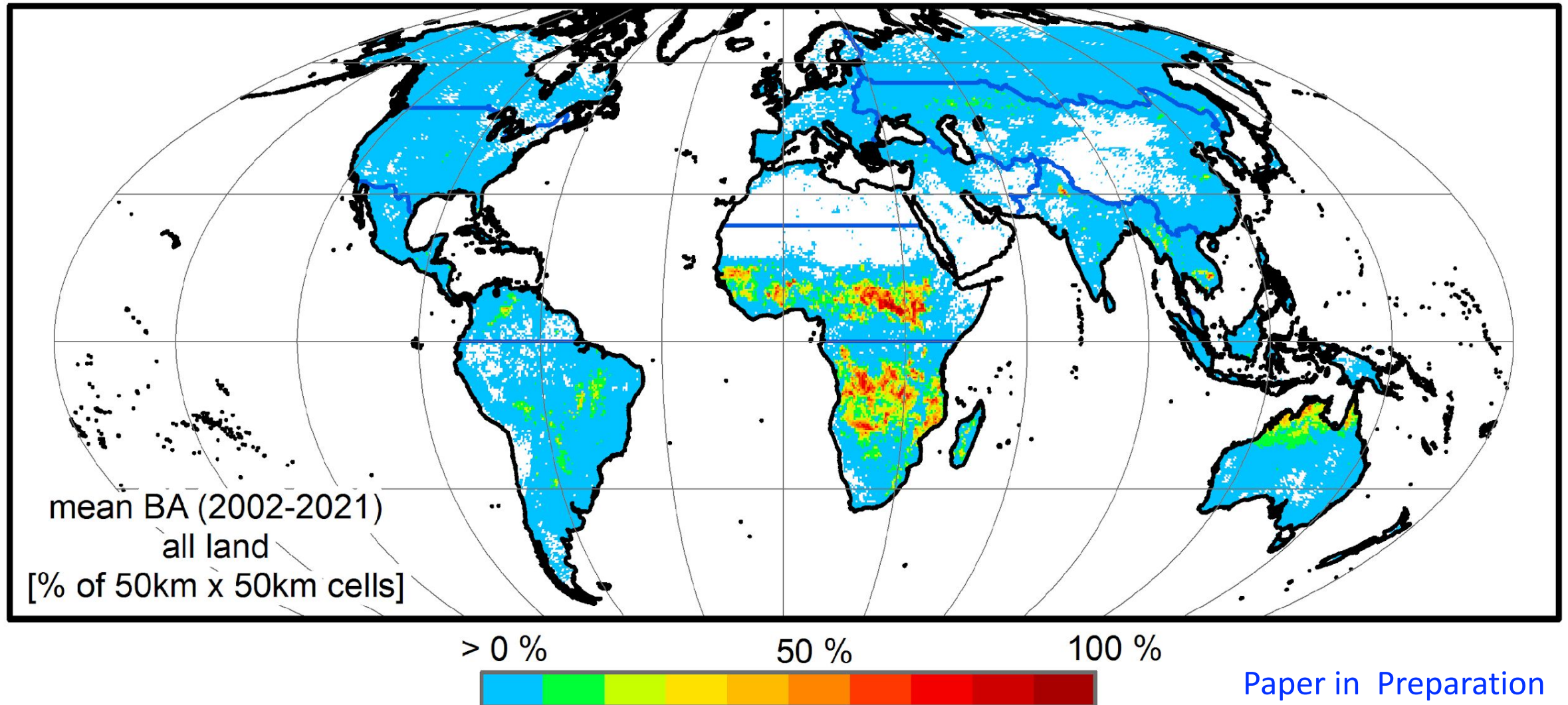


Colors show  
approximate day  
of burning



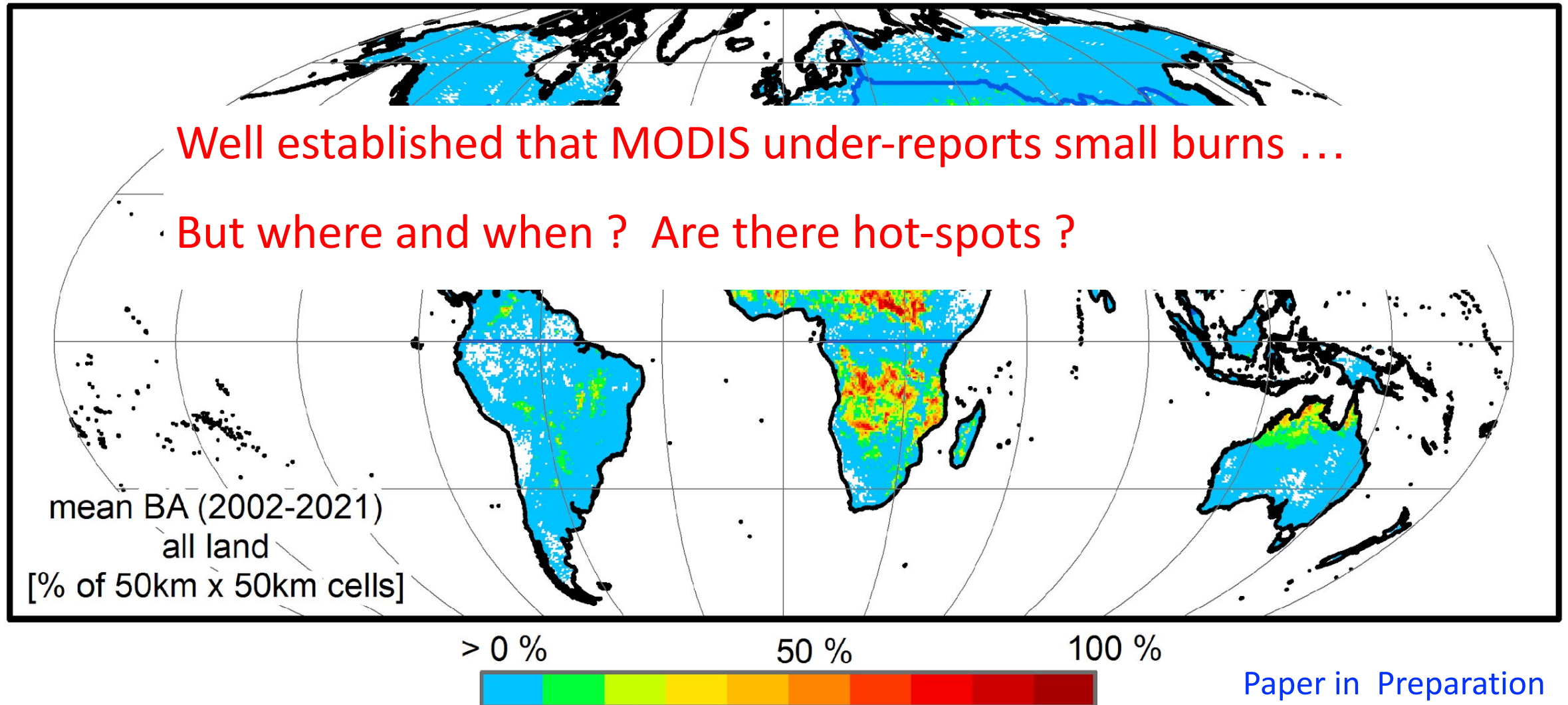
# Mean Burned Area mapped by NASA MODIS 500m product for 2002-2021

on average 2.7 % of the land surface reported as burned each year



# Mean Burned Area mapped by NASA MODIS 500m product for 2002-2021

on average 2.7 % of the land surface reported as burned each year





# Under-reporting example

August 24<sup>th</sup> 2001

Road North to the  
Chimaliro  
forest reserve,  
Malawi

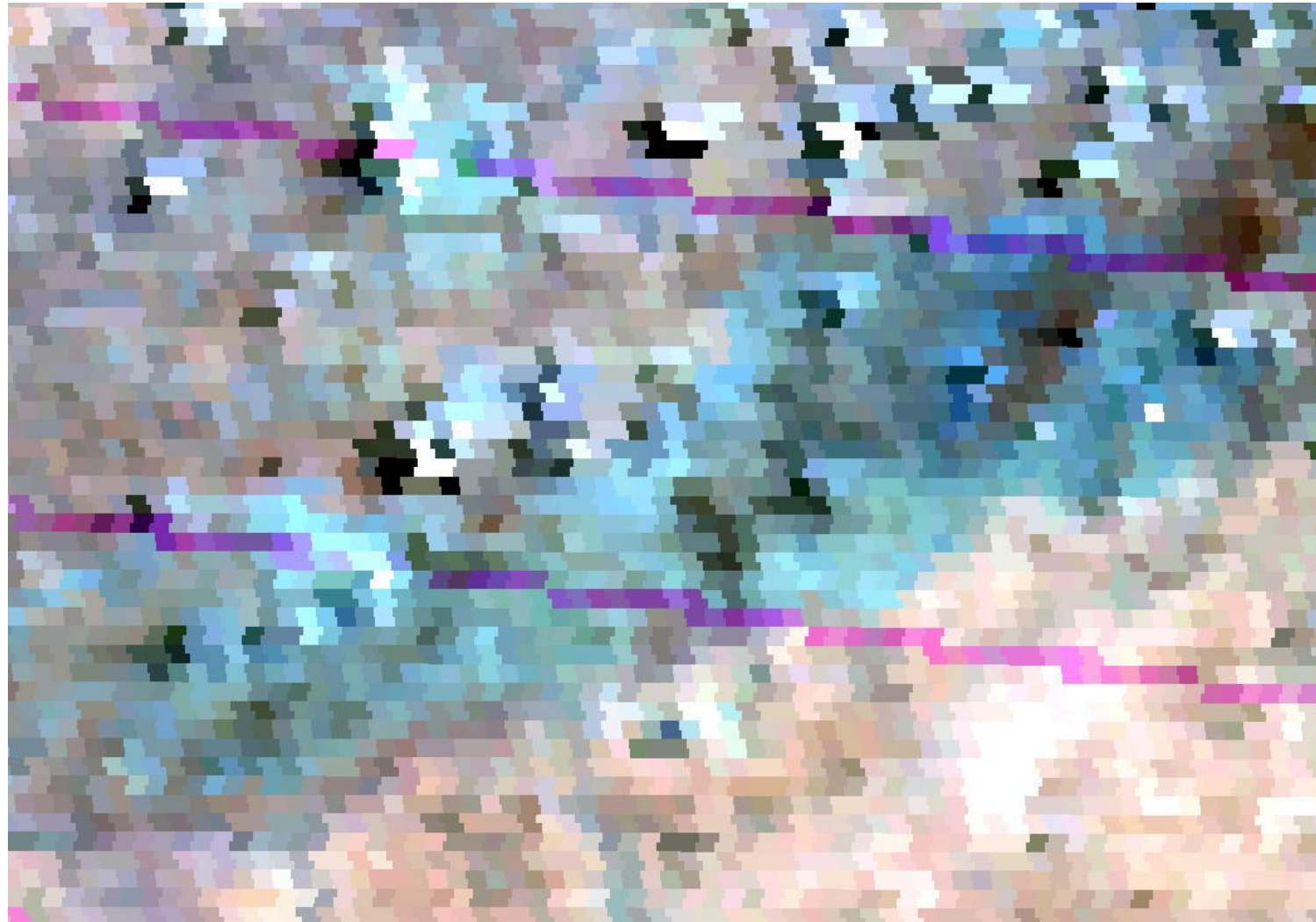
miombo woodland  
reserve - the hilly  
area on the horizon



D. Roy

# September 26<sup>th</sup> 2001, Chimaliro forest reserve

MODIS 500 m pixels (1.65 $\mu$ m, 1.24 $\mu$ m, 0.86 $\mu$ m)

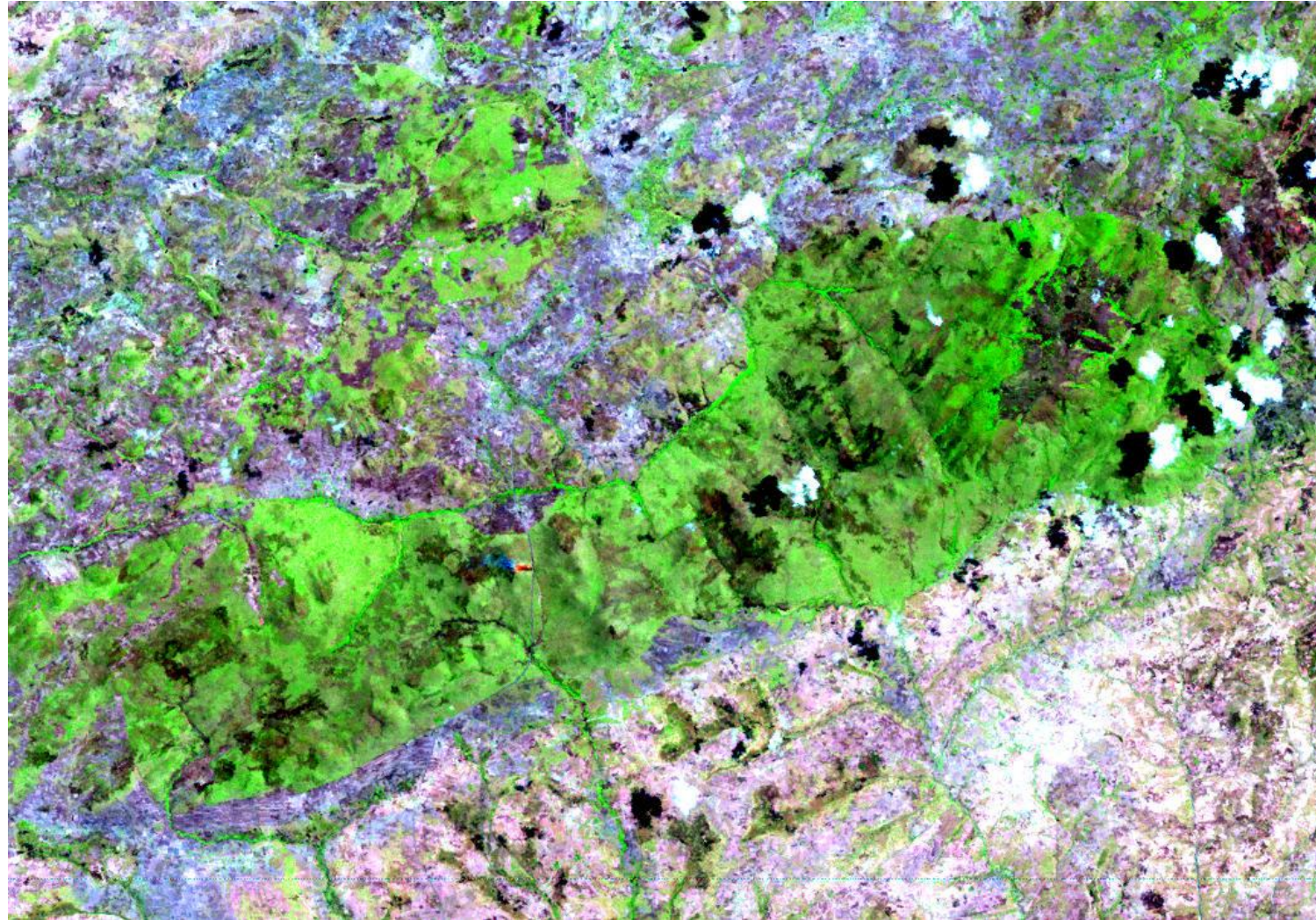


31km x 23km



September 26<sup>th</sup> 2001, Chimaliro forest reserve

Landsat 30 m pixels (1.65 $\mu$ m, 0.82 $\mu$ m, 0.66 $\mu$ m)



31km x 23km

# Quantifying small burns is rather important for applications and science !

JOURNAL OF GEOPHYSICAL RESEARCH  
**Biogeosciences**  
AN AGU JOURNAL



## Global burned area and biomass burning emissions from small fires

J. T. Randerson , Y. Chen, G. R. van der Werf, B. M. Rogers, D. C. Morton

First published: 11 December 2012

“Accounting for small fires increased total global burned area by ~35%, but a formal quantification of uncertainties was not possible ... “



Under our previous NASA LCLUC funding:

Africa 30 m

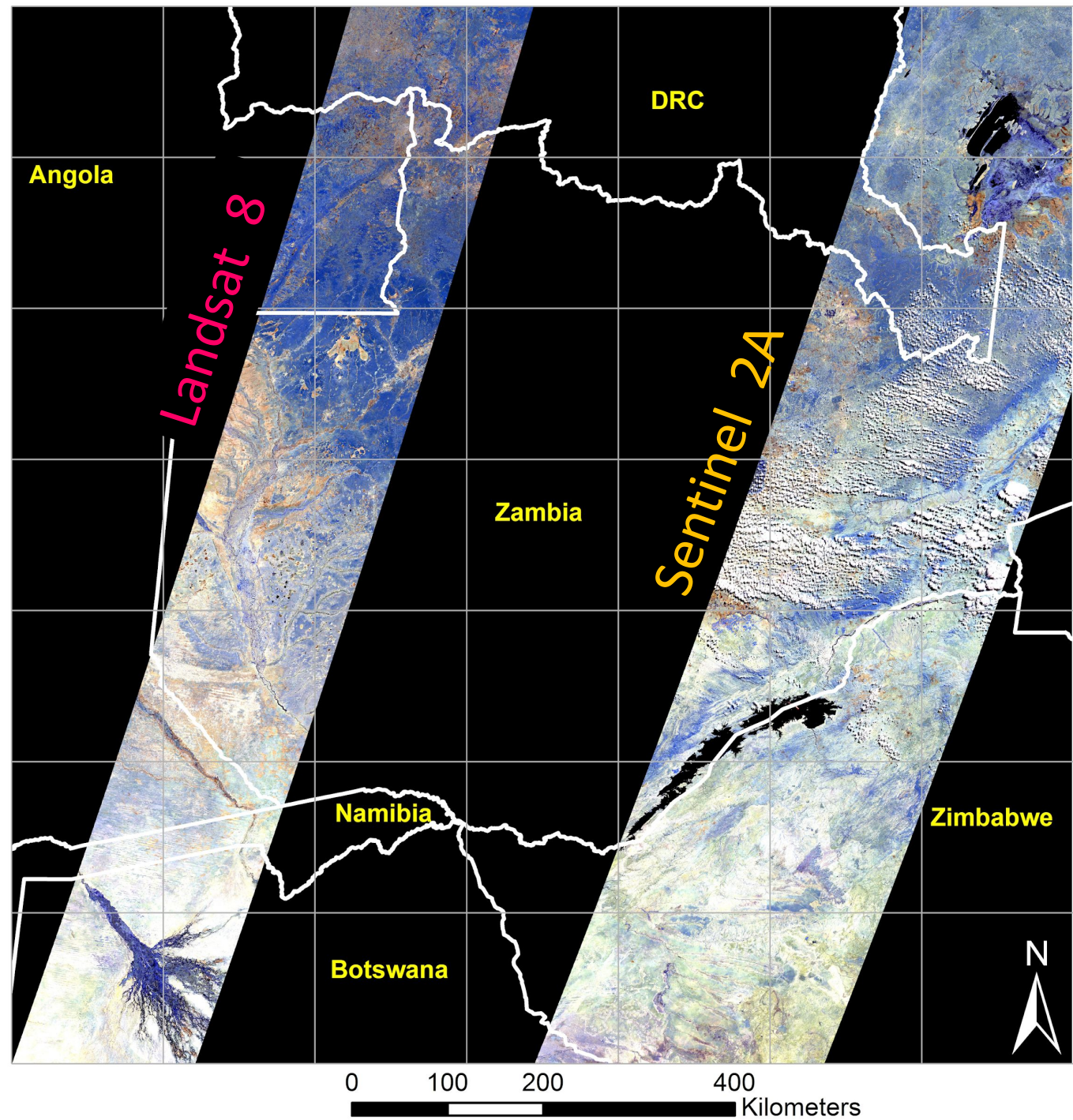
# NASA Harmonized Landsat Sentinel-2 (HLS) Burned Area Product Generation

Roy, Huang, et al. 2019, Landsat-8 and Sentinel-2 burned area mapping - a combined sensor multi-temporal change detection approach, *RSE*, 231, 111254.



Landsat 8 and Sentinel  
S2

same day



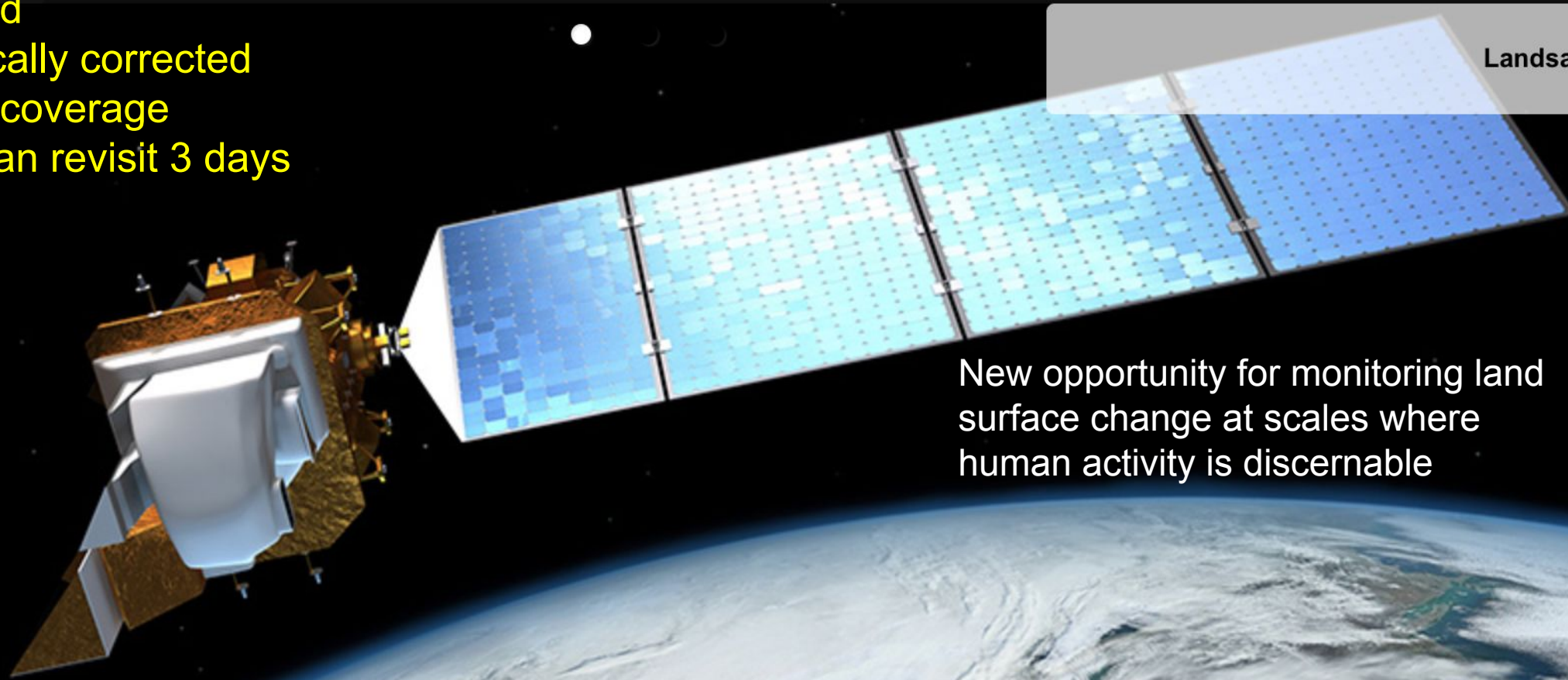




# Harmonized Landsat Sentinel-2

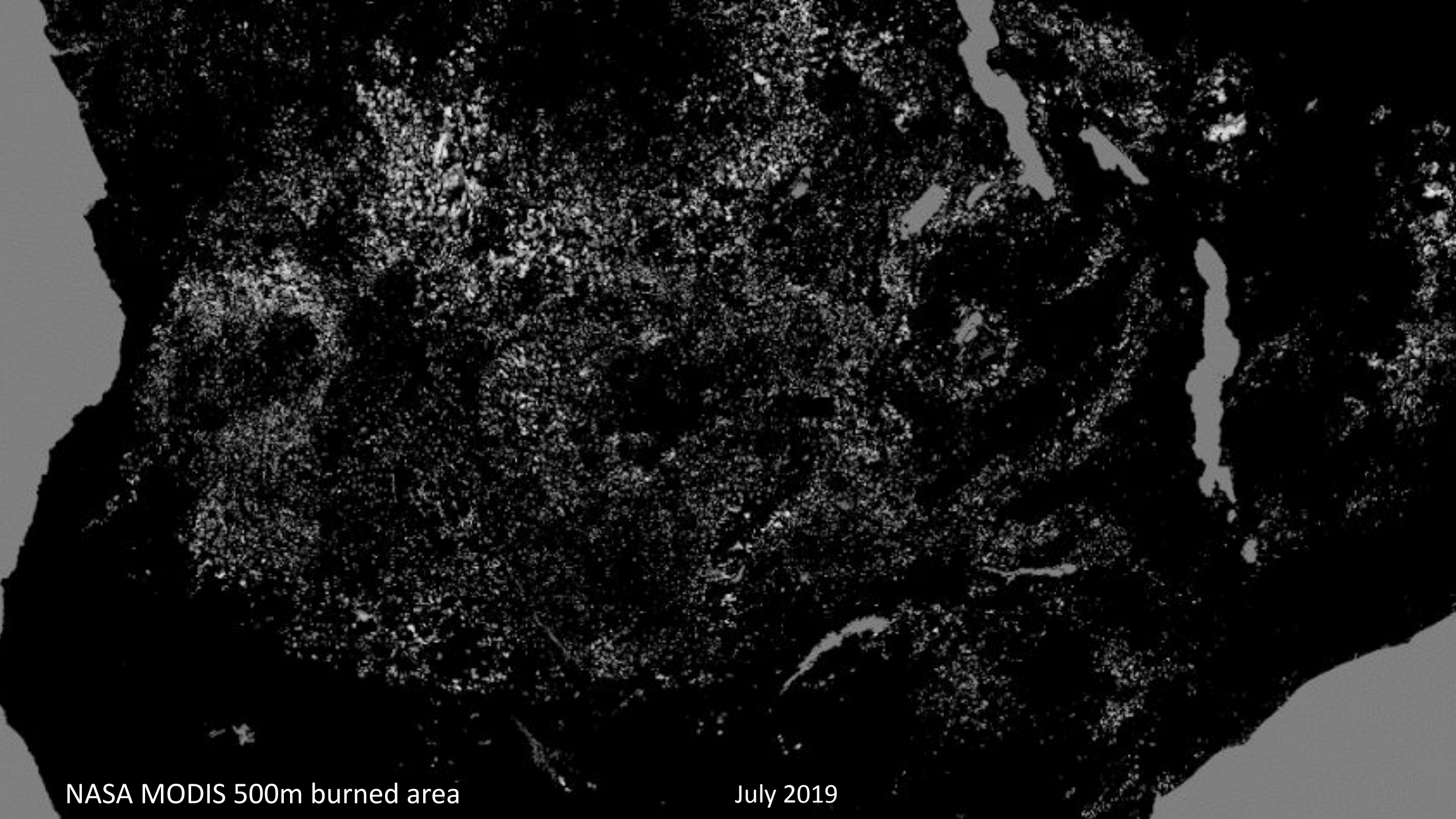
[Home](#)[Algorithms](#)[Products Description](#)[Test Sites](#)[Data](#)[QA](#)[Documents](#)[News](#)

- 30 m gridded
- atmospherically corrected
- near-global coverage
- global median revisit 3 days



Landsat 8

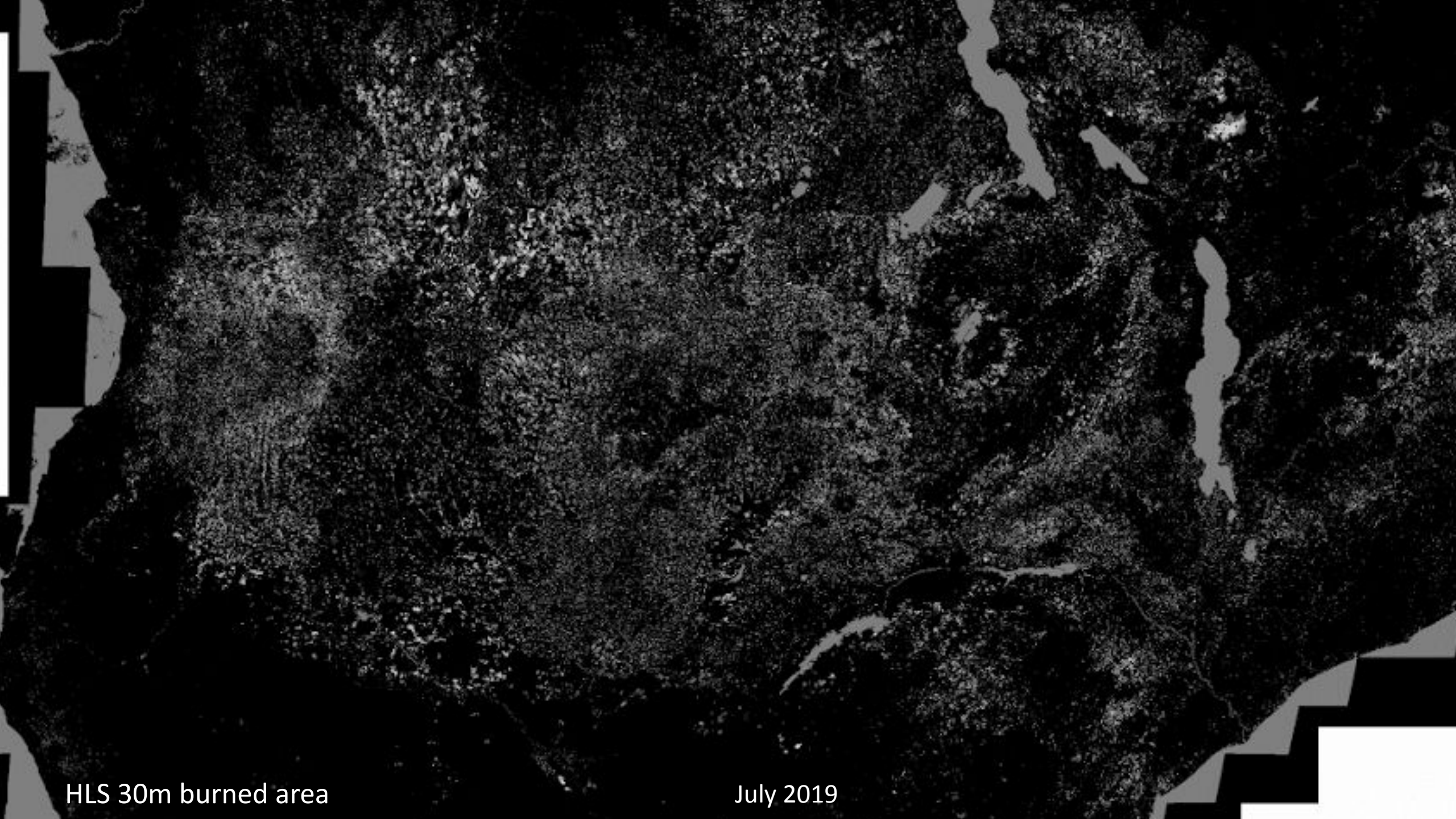
New opportunity for monitoring land surface change at scales where human activity is discernable



NASA MODIS 500m burned area

July 2019





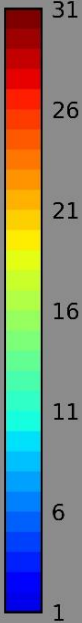
HLS 30m burned area

July 2019

Sentinel-2 &  
Landsat-8 30 m  
Burned Area

Jan 2019

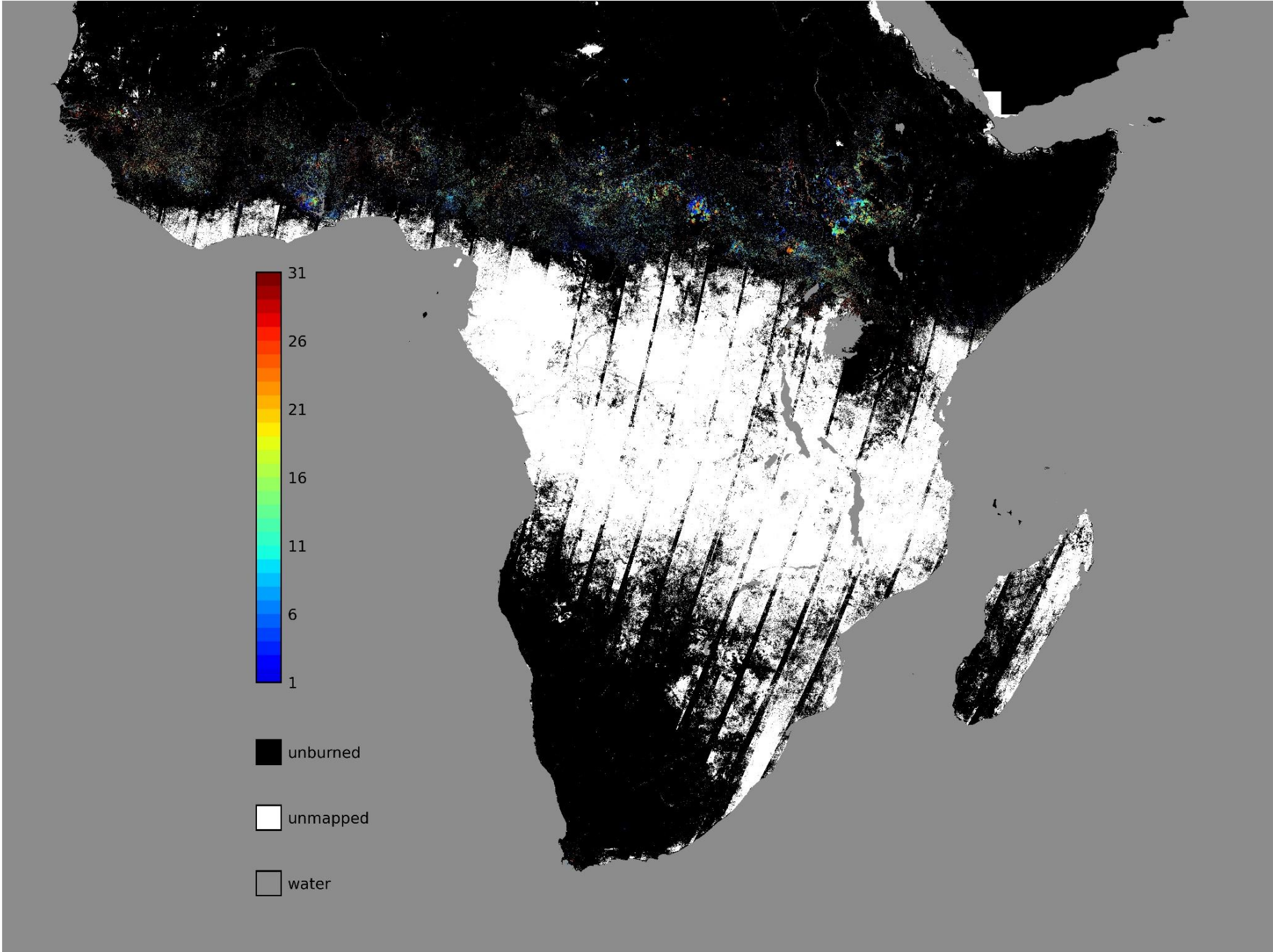
2861  
109 x 109 km  
HLS tiles



■ unburned

□ unmapped

□ water





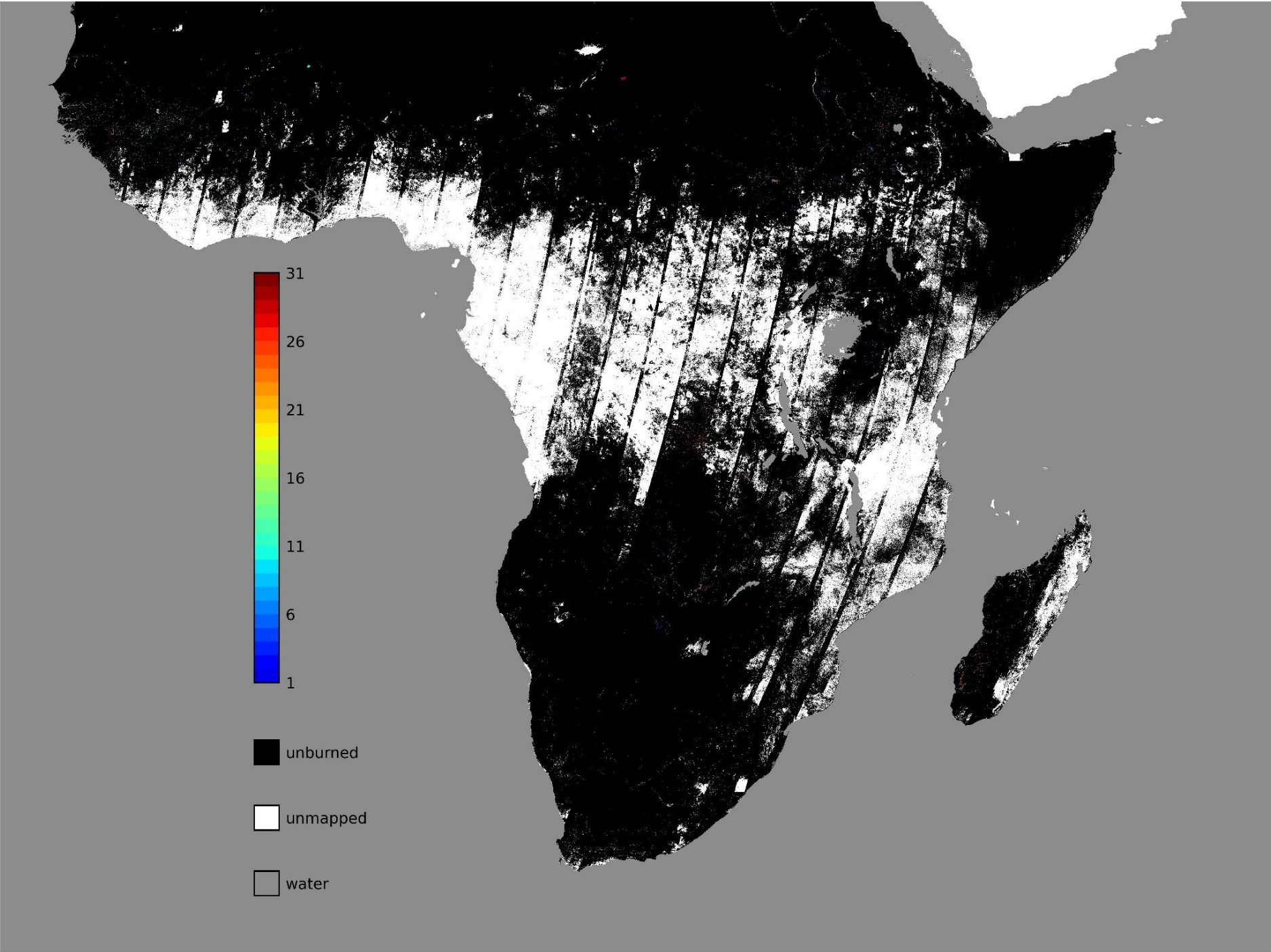
Sentinel-2 &  
Landsat-8 30 m  
Burned Area

Apr 2019

2861  
109 x 109 km  
HLS tiles



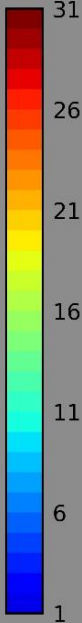
-  unburned
-  unmapped
-  water



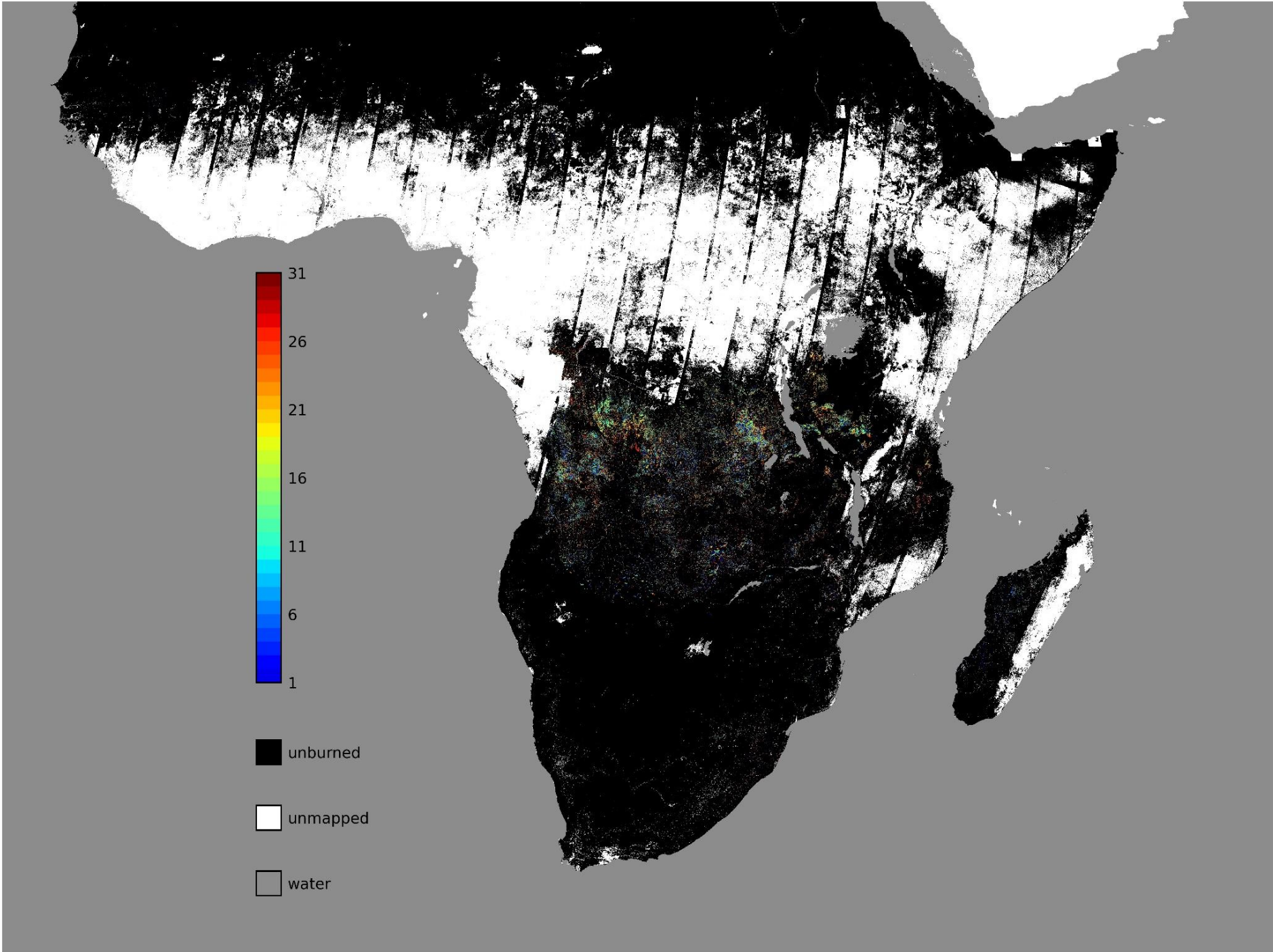
Sentinel-2 &  
Landsat-8 30 m  
Burned Area

June 2019

2861  
109 x 109 km  
HLS tiles



-  unburned
-  unmapped
-  water

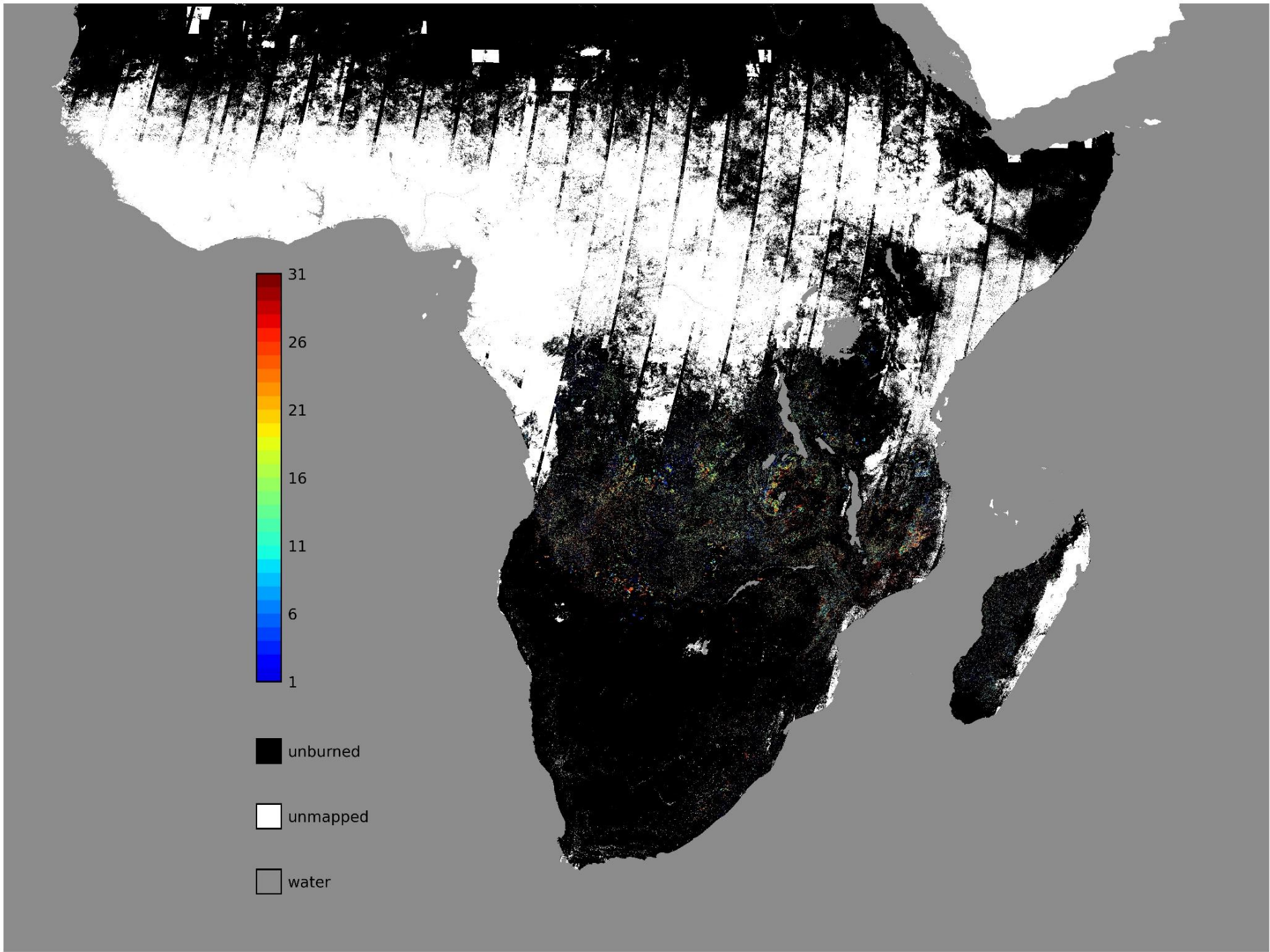




Sentinel-2 &  
Landsat-8 30 m  
Burned Area

Aug 2019

2861  
109 x 109 km  
HLS tiles



# Where are the Missing Burned Areas?

## Global Hotspots of Burned Area - A Multiresolution Analysis

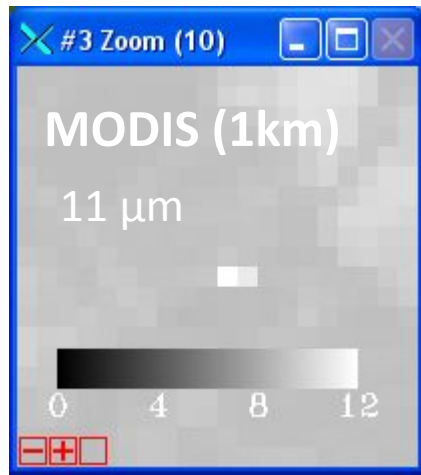
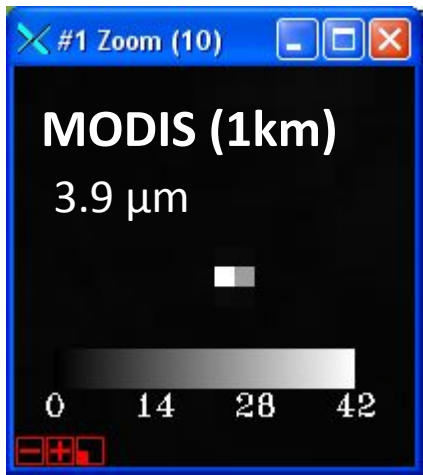
- **Task #1** Identify global hot-spots of burned areas, specifically where the burns are missing at MODIS 500 m resolution.
- **Task #2** Map the burned area in the identified hot-spots at 30 m resolution.
- **Task #3** Validate the 30 m burned area hot-spot mapping results using contemporaneous 3m PlanetScope data.
- **Task #4** Provide the hot-spot 30 m burned area maps and 3 m PlanetScope validation data to the public.
- **Task #5** Quantify the global MODIS 500 m burned area product underestimation due to its omission of small burns.



# Where are the Missing Burned Areas?

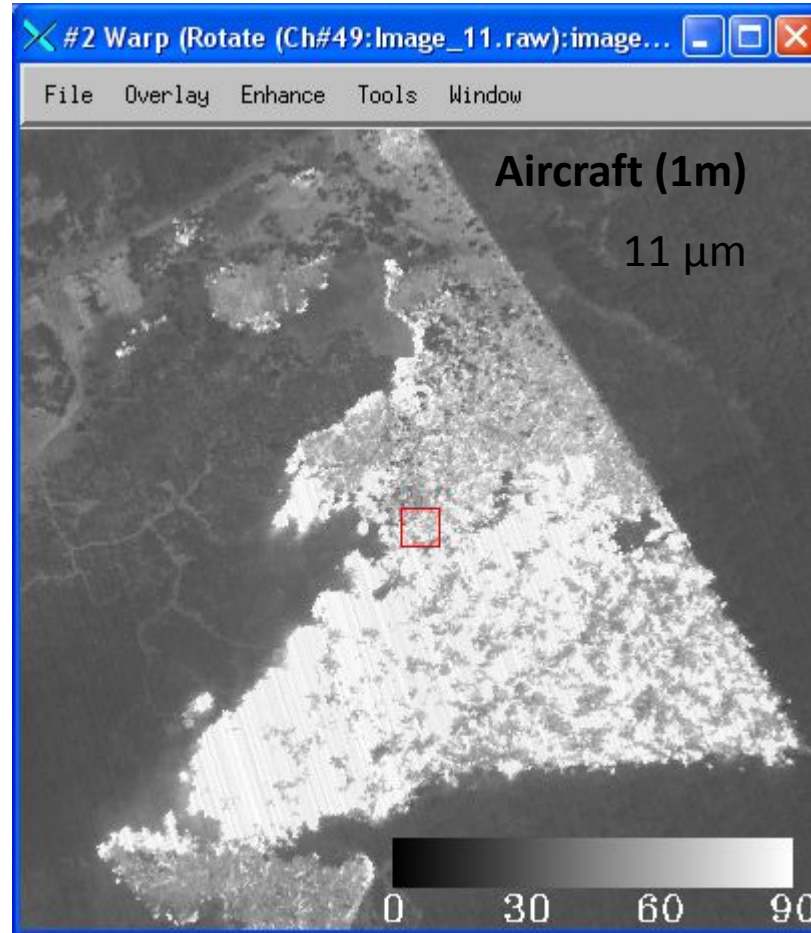
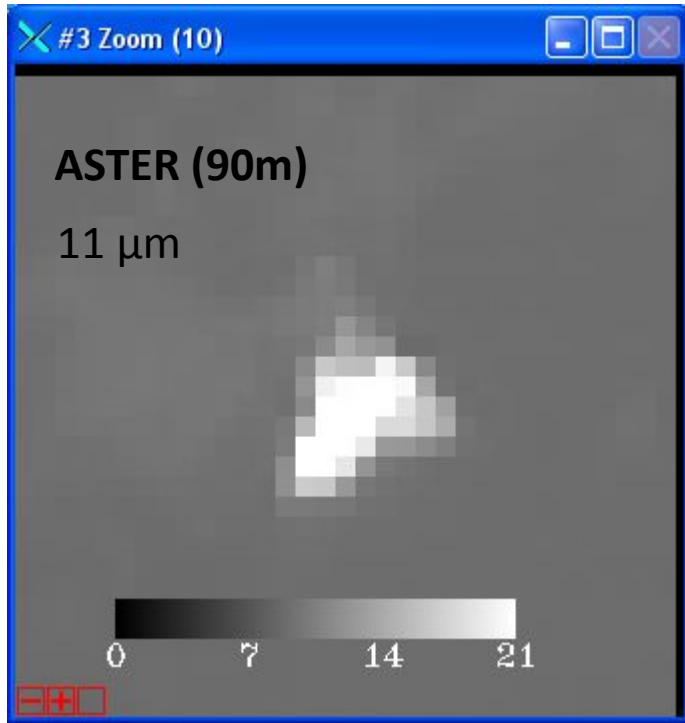
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Well established that thermal  $\lambda$  active fire detection algorithms can detect small fires not apparent in reflective  $\lambda$  data

radiance [W m<sup>-2</sup> μm<sup>-1</sup> sr<sup>-1</sup>]

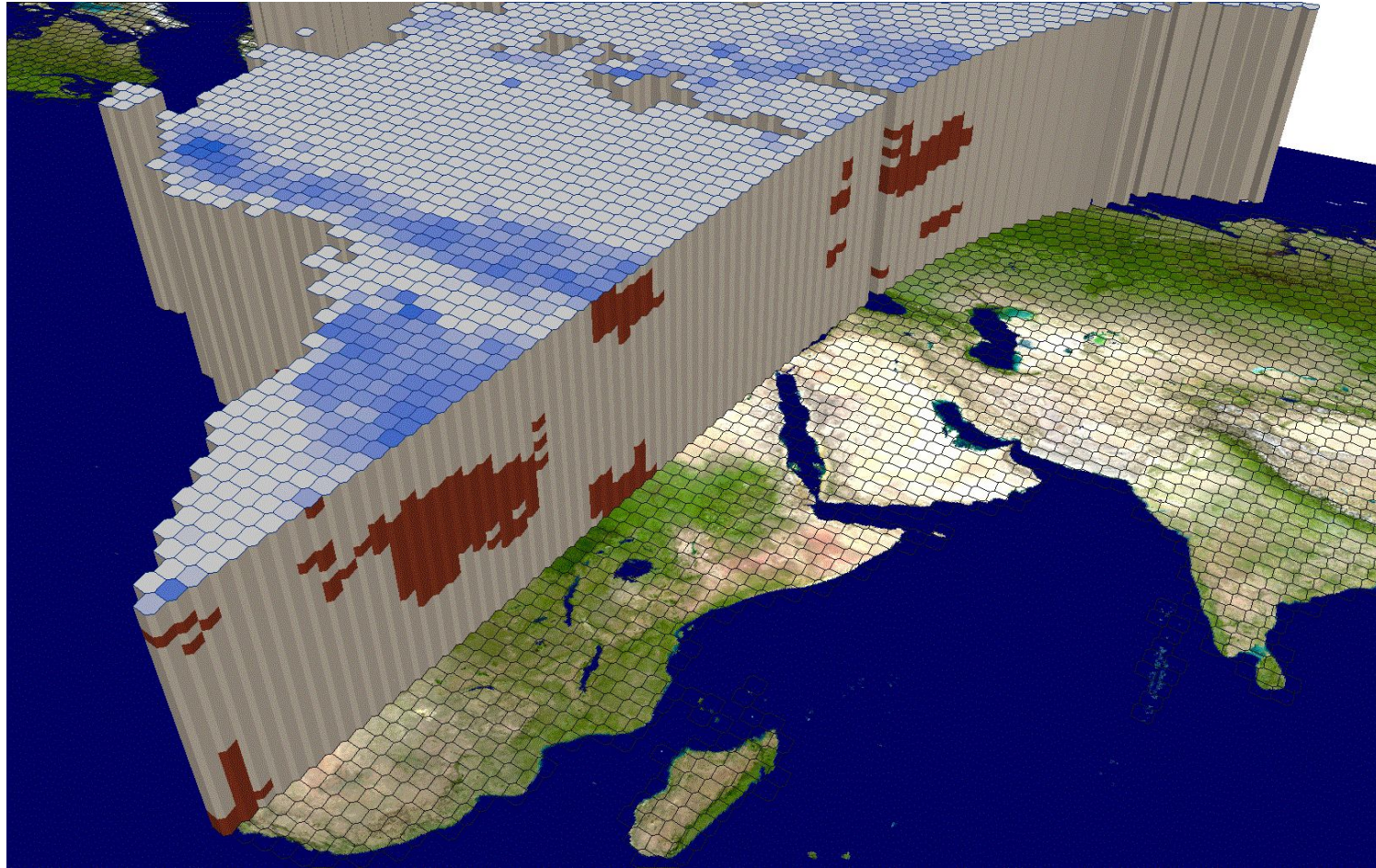


uncalibrated raw counts

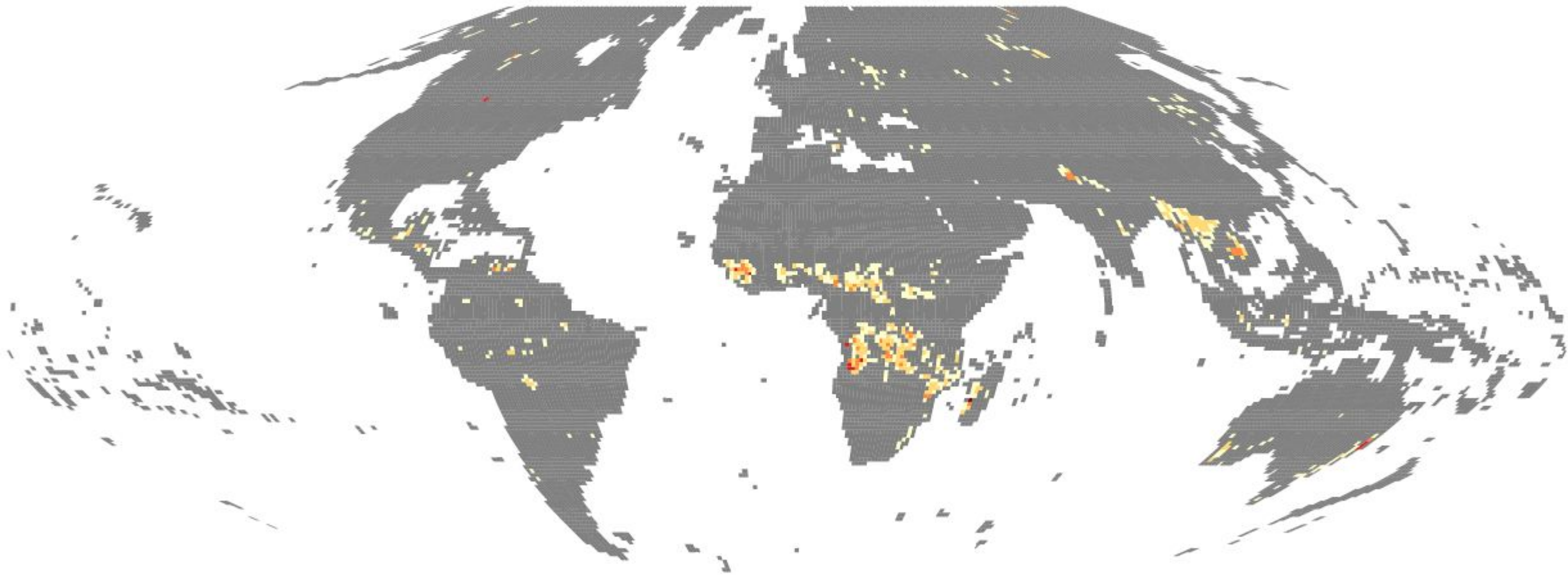
Roraima,  
Brazil, Jan. 28 2003



# Hot-spot selection approach



- Spatial stratification
  - HLS 109 x 109 km tile grid
  - 7 biome global map
- Temporal stratification
  - calendar months
- Rank the HLS tiles in each month by the proportion of VIIRS 375 m active fire detections occurring outside 500 m MODIS burned areas



Count

All 12 months of 2019



Top 1000 hot-spots with greatest incidence of VIIRS 375 m active fire detections outside of MODIS 500 m burned areas (different number selected per biome using a biome area proportional allocation)



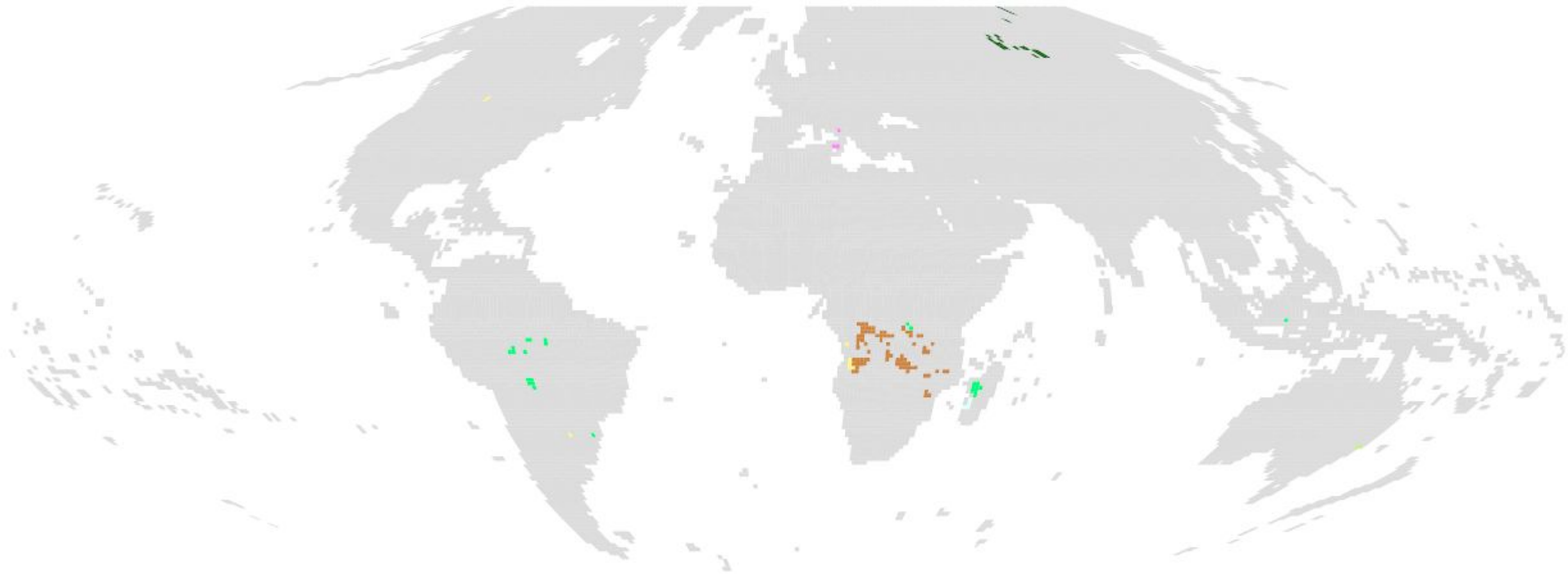


Biome

■	tropical_forest	, 15
■	temperate_forest	, 1
■	boreal_forest	, 0
■	tropical_savannah	, 90
■	temperate_savannah	, 0
■	mediterranean	, 0
■	deserts_and_xeric_shrublands	, 4

January 2019

Of the 1000 the **top 110 hot-spots** with greatest incidence of VIIRS 375 m active fire detections outside of MODIS 500 m burned areas



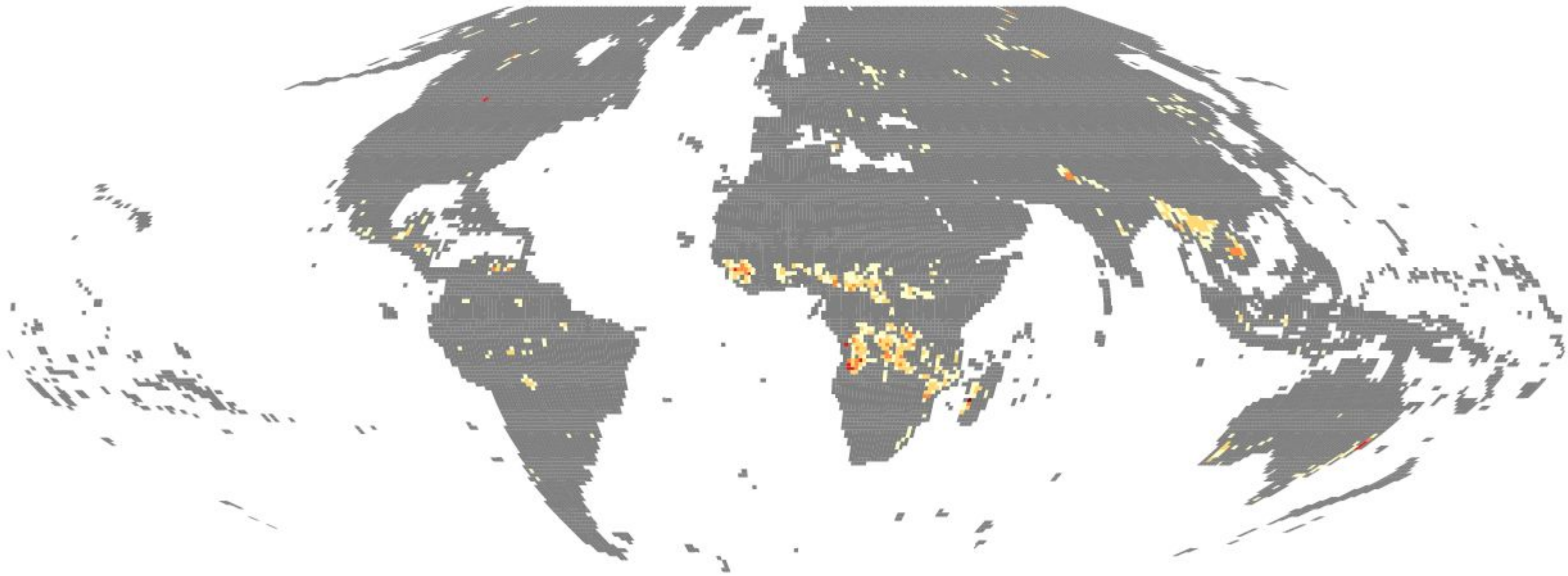
Biome

■	tropical_forest , 25
■	temperate_forest , 1
■	boreal_forest , 19
■	tropical_savannah , 77
■	temperate_savannah , 7
■	mediterranean , 3
□	deserts_and_xeric_shrublands , 4

August 2019

Of the 1000 the **top 136 hot-spots** with greatest incidence of VIIRS 375 m active fire detections outside of MODIS 500 m burned areas





- We have generated monthly ranked hot-spot lists with 1000s of entries per month (as there are >18,000 HLS land tiles)
- Final ones used (for Tasks #2-5) depend on HLS and PlanetScope availability

# Where are the Missing Burned Areas?

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- **Task #2** Map the burned area in the identified hot-spots at 30 m resolution.



# Where are the Missing Burned Areas?

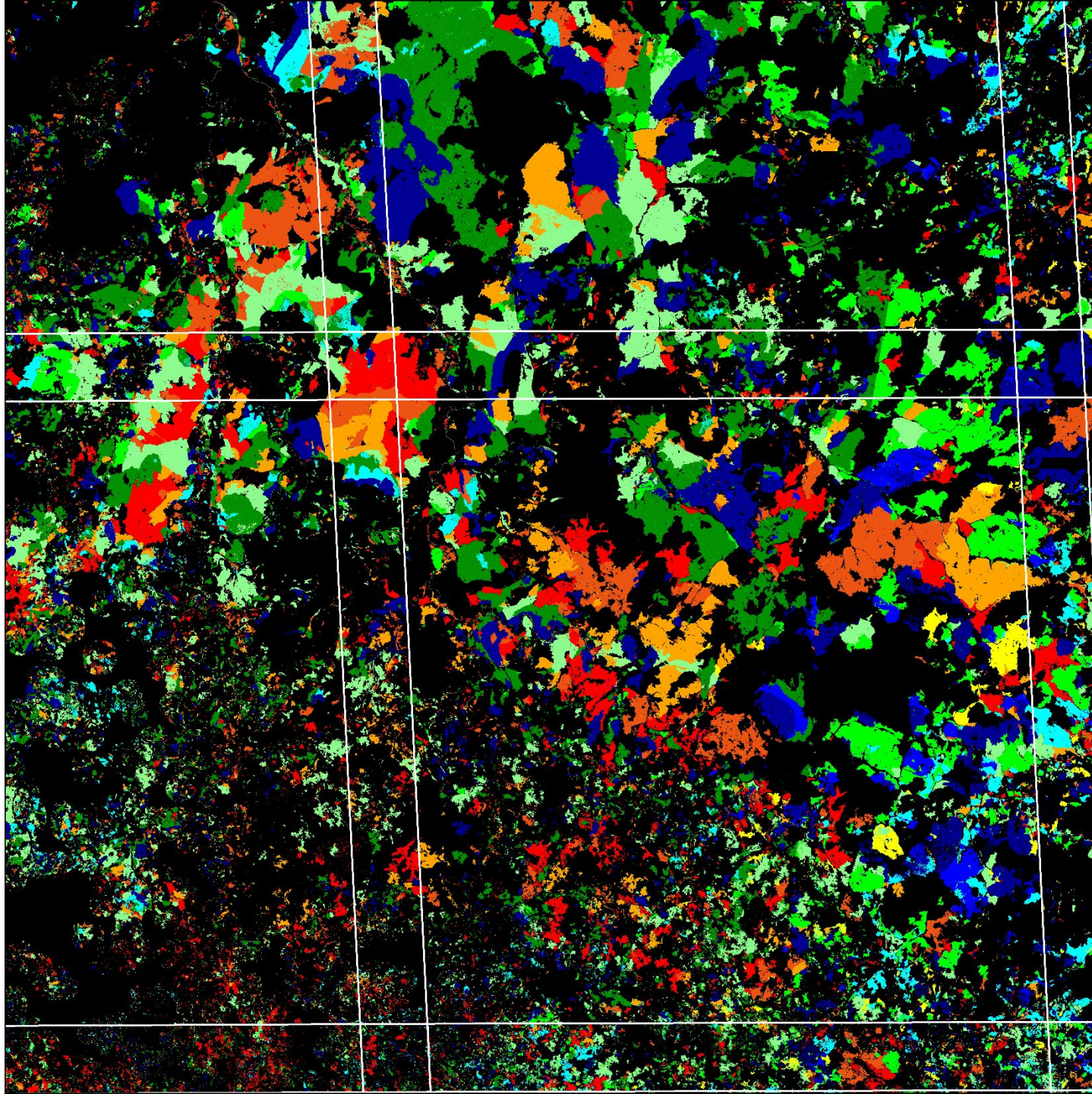
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**HLS 30 m**  
burned area

Jan 2019

**109 x 109 km HLS tiles**  
center at 6.70°N, 18.77°E



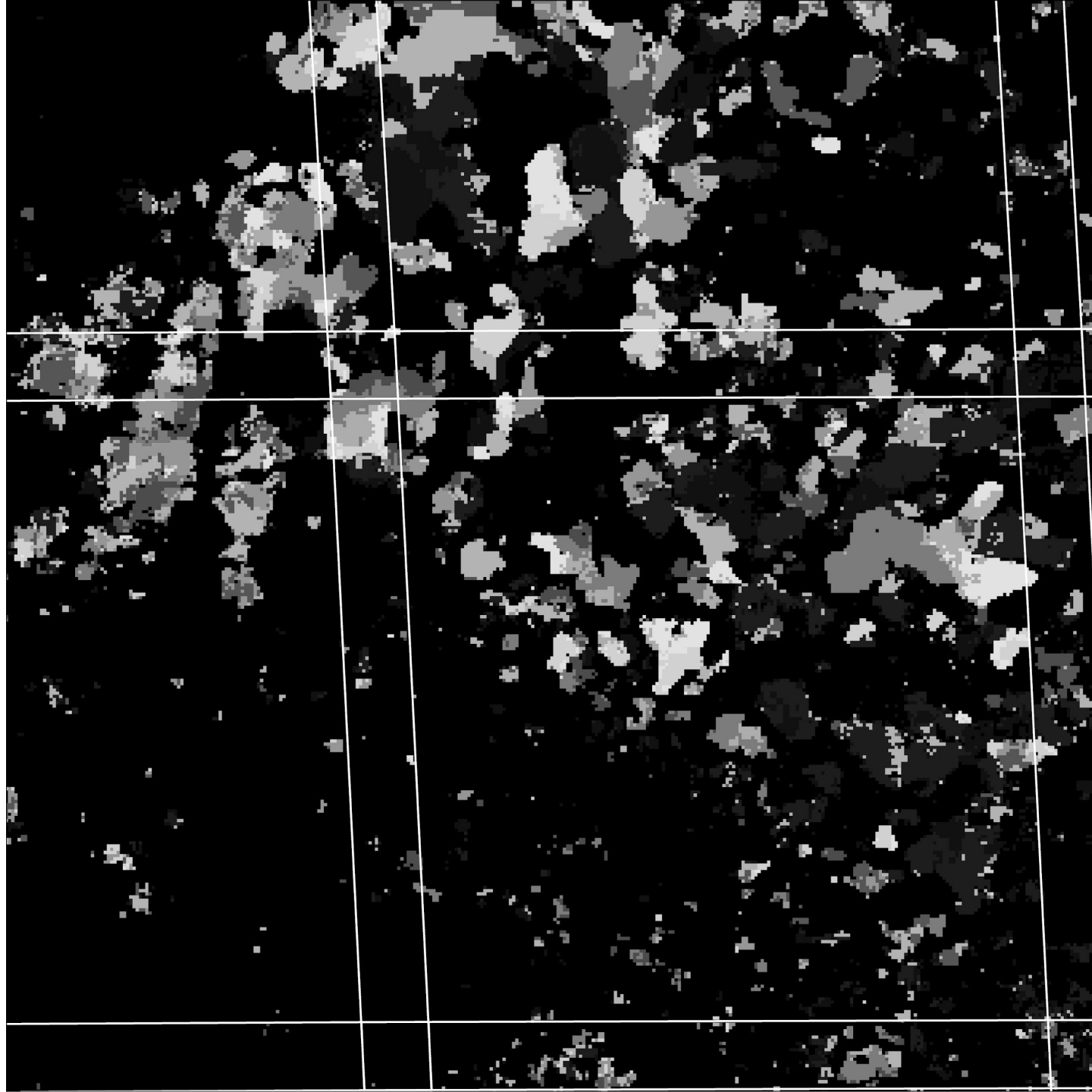
Example  
selected  
hot-spot  
tile



**MODIS 500 m**  
burned area

Jan 2019

**109 x 109 km HLS tiles**  
center at 6.70°N, 18.77°E



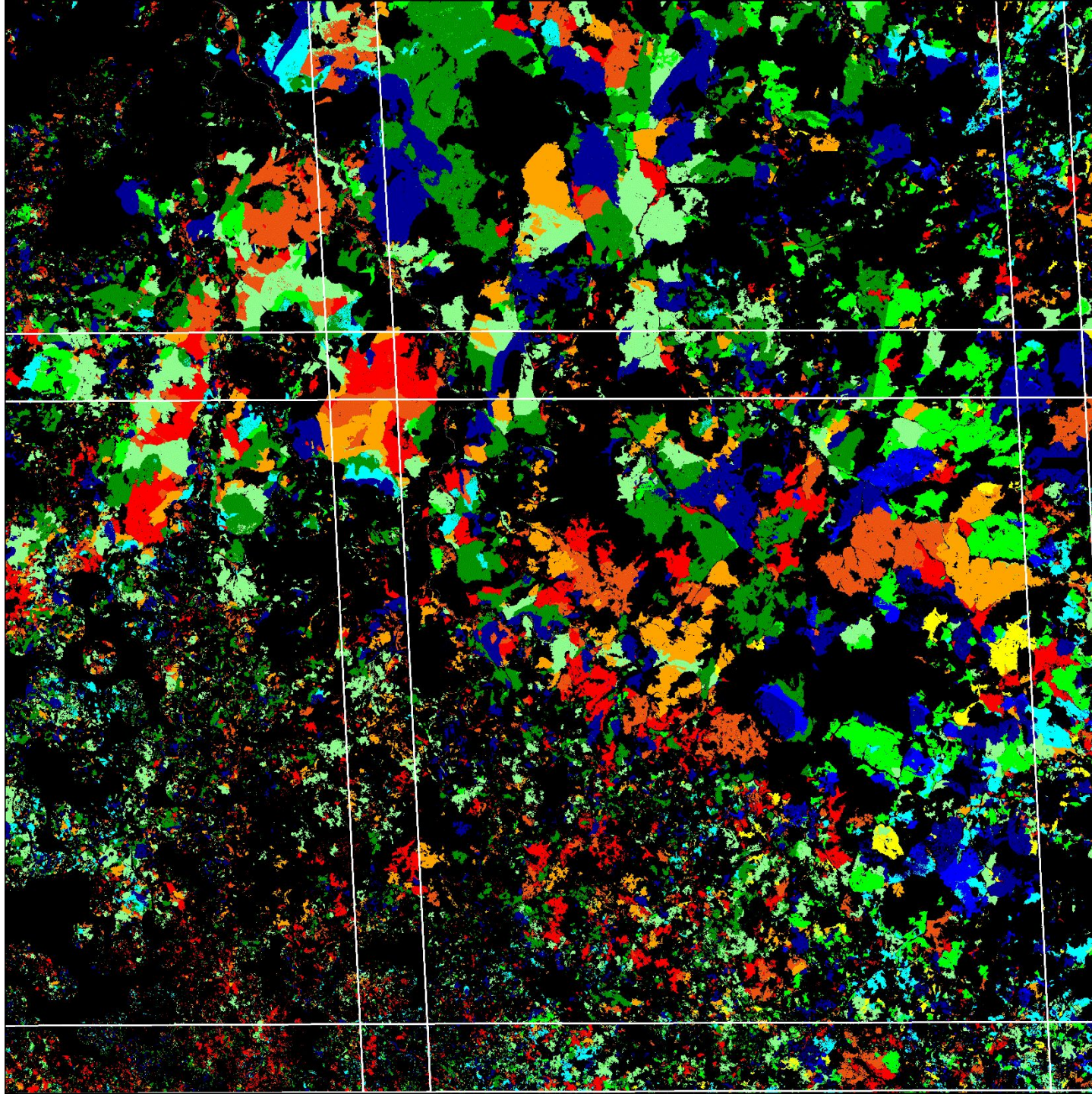
Example  
selected  
hot-spot  
tile



**HLS 30 m**  
burned area

Jan 2019

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Example  
selected  
hot-spot  
tile



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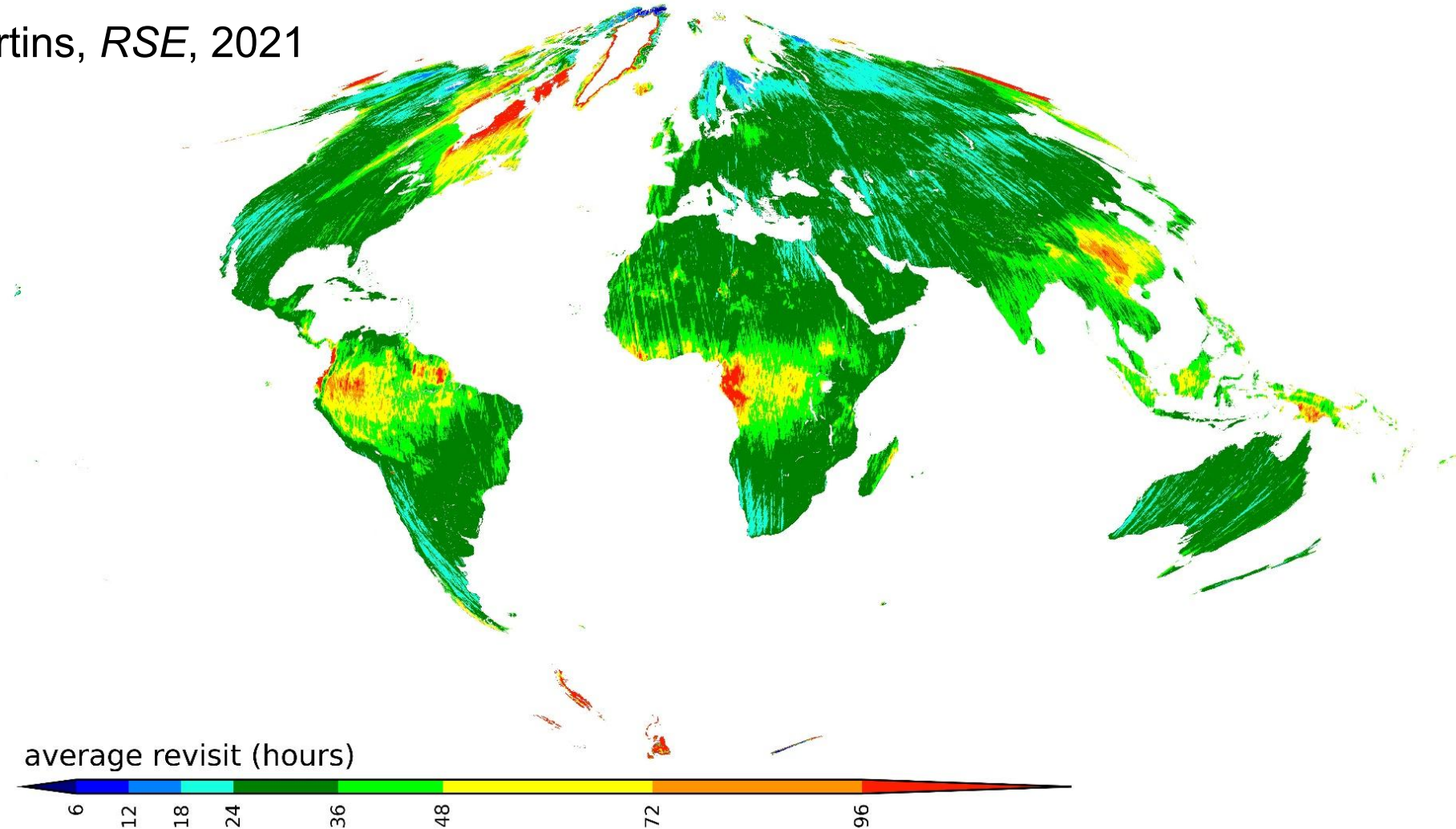
# PlanetScope constellation average revisit interval analysis

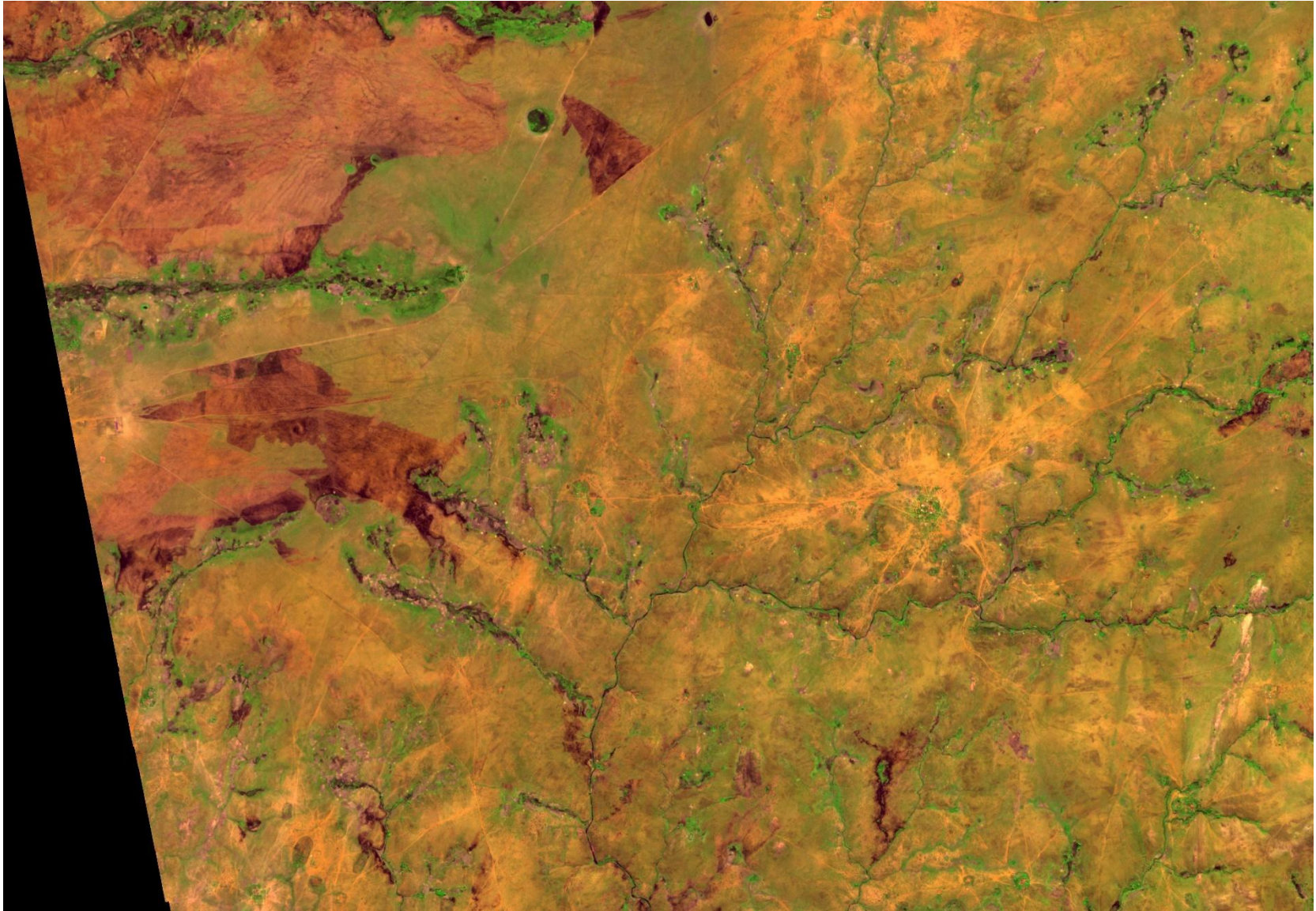


- ~200 sensors
- ~3m
- blue / green / red / NIR  $\lambda$

Roy, Huang, Houborg, Martins, *RSE*, 2021

Global  
median  
PlanetScope  
revisit  
**30.3 hours !**





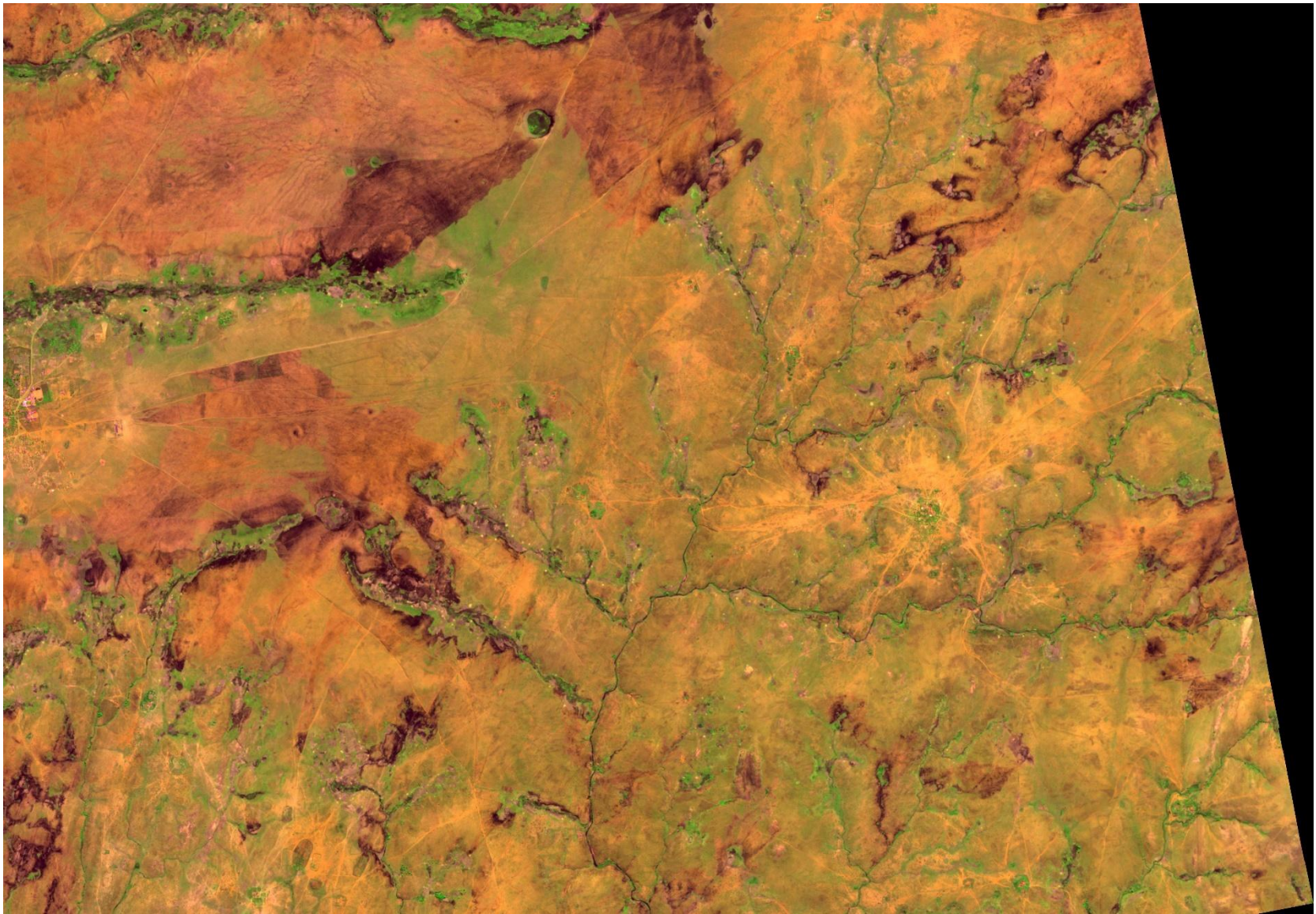
630 nm  
820 nm  
545 nm  
surface reflectance

Isalo National Park  
Madagascar

15.4 × 10.7 km  
5134 × 3568 3 m pixels

July 12<sup>nd</sup> 2019





630 nm  
820 nm  
545 nm  
surface reflectance

Isalo National Park  
Madagascar

15.4 × 10.7 km  
5134 × 3568 3 m pixels

July 16<sup>th</sup> 2019



Used Landsat-8 two date image pairs interpreted into burned, unburned, and unmapped classes



(Landsat-8 interpreted data used previously to validate the MODIS burned area product)

for transfer learning to PlanetScope

## Deep learning high resolution burned area mapping by transfer learning from Landsat-8 to PlanetScope

V.S. Martins <sup>a</sup>, D.P. Roy <sup>a, b</sup>, H. Huang <sup>a</sup>, L. Boschetti <sup>c</sup>, H.K. Zhang <sup>d</sup>, L. Yan <sup>a</sup>

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<https://doi.org/10.1016/j.rse.2022.113203>

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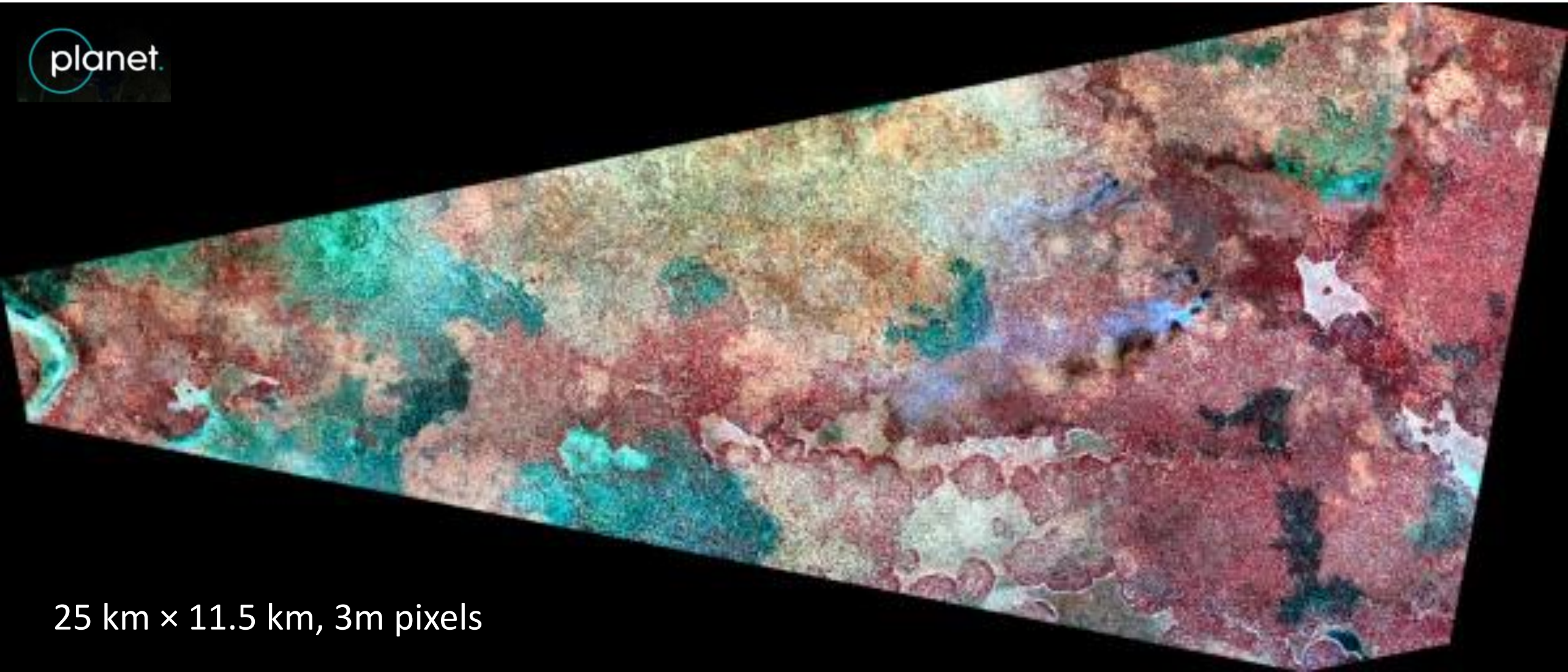
### Highlights

- PlanetScope two-date 3 m burned area deep learning classification.
- Transfer learning with pre-existing Landsat-8 derived burned area reference data.
- Results for 659 radiometrically normalized PlanetScope image pairs across Africa.
- Classification with 12% 3 m burn omission and commission errors.
- Commission and omission errors largely compensate at 30 m resolution.



PlanetScope 2019 July 5<sup>th</sup>

planet.

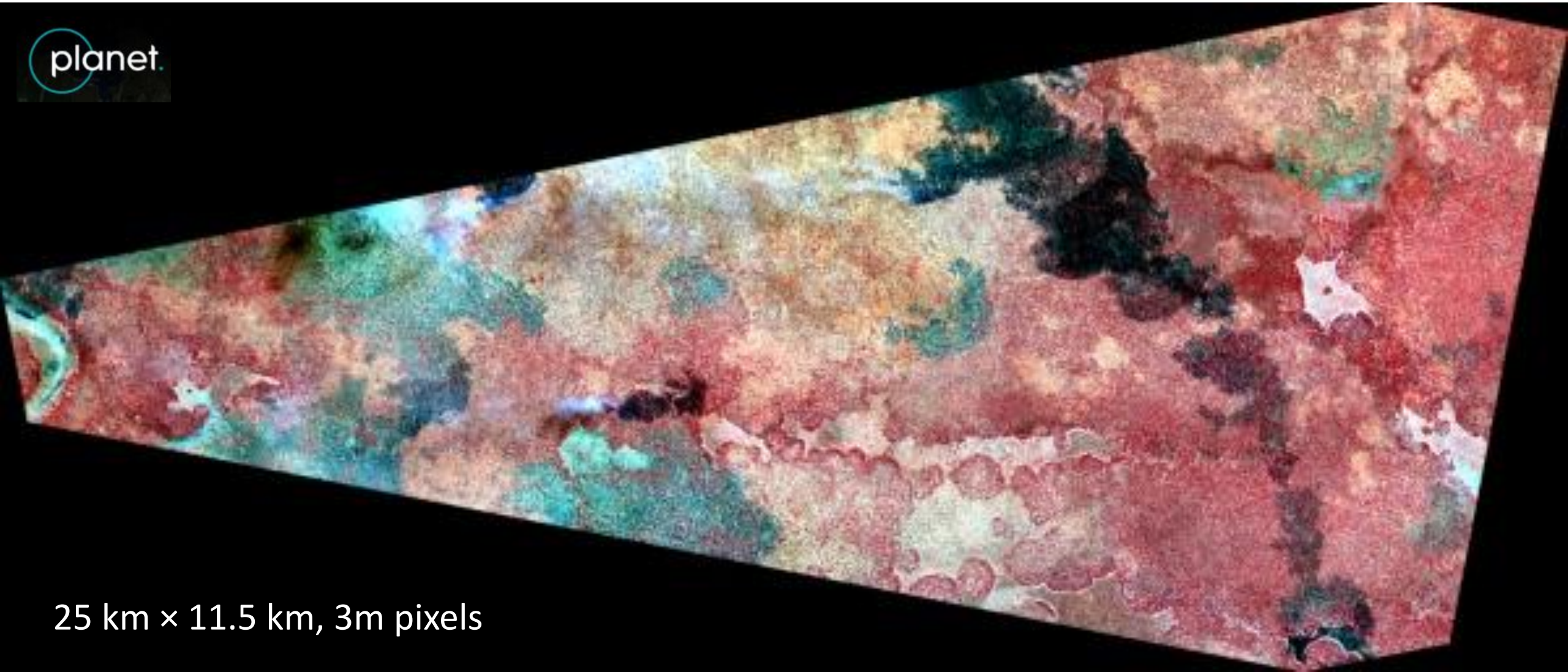


25 km × 11.5 km, 3m pixels



PlanetScope 2019 July 6<sup>th</sup>

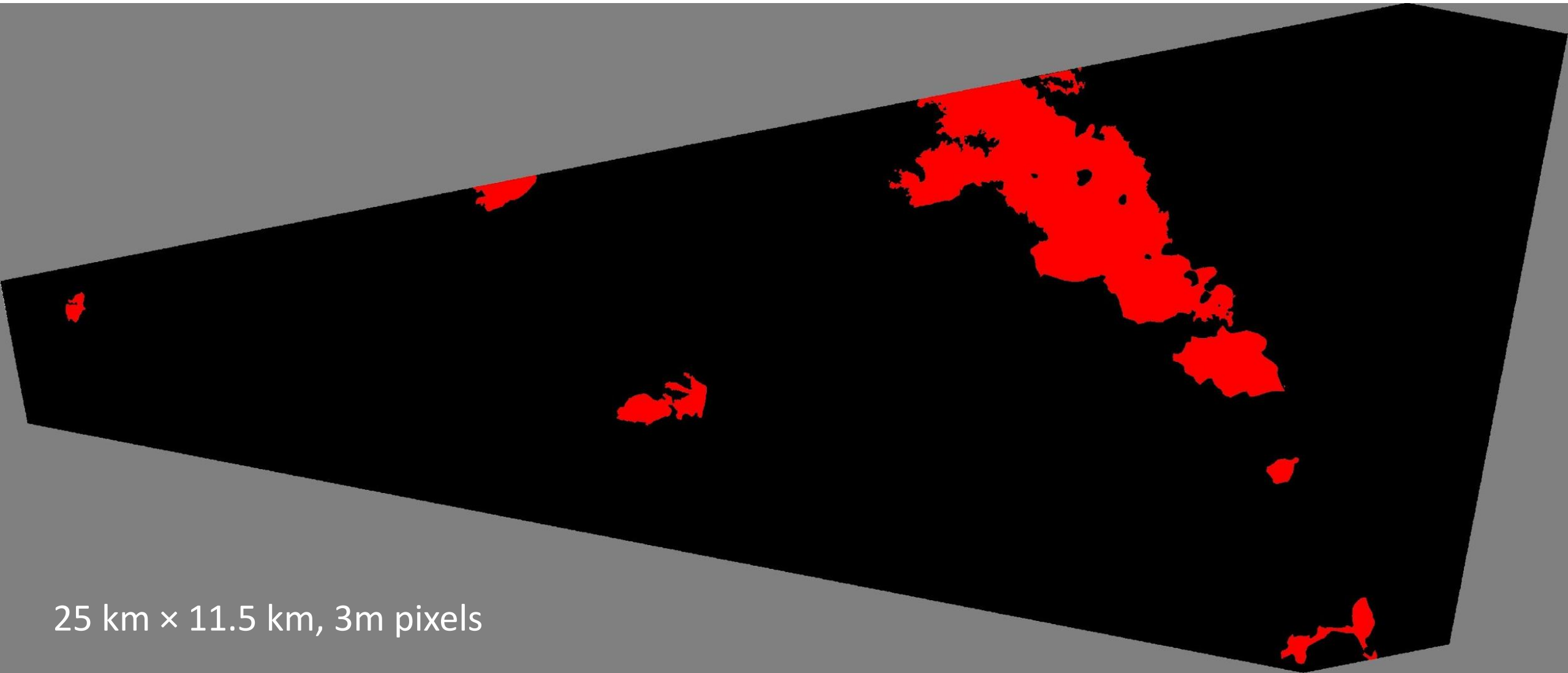
planet.



25 km × 11.5 km, 3m pixels

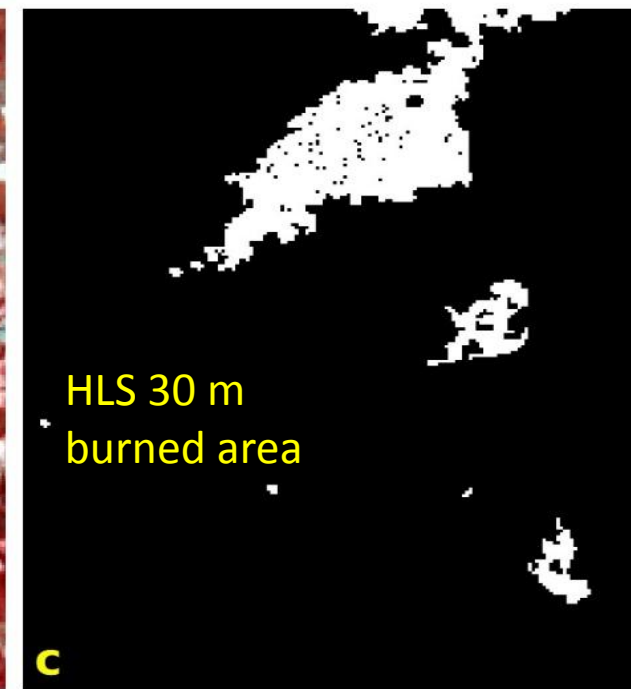
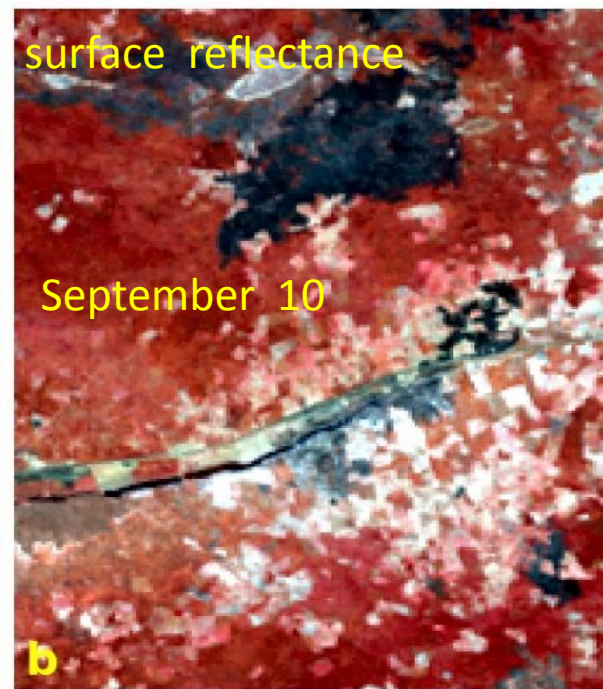
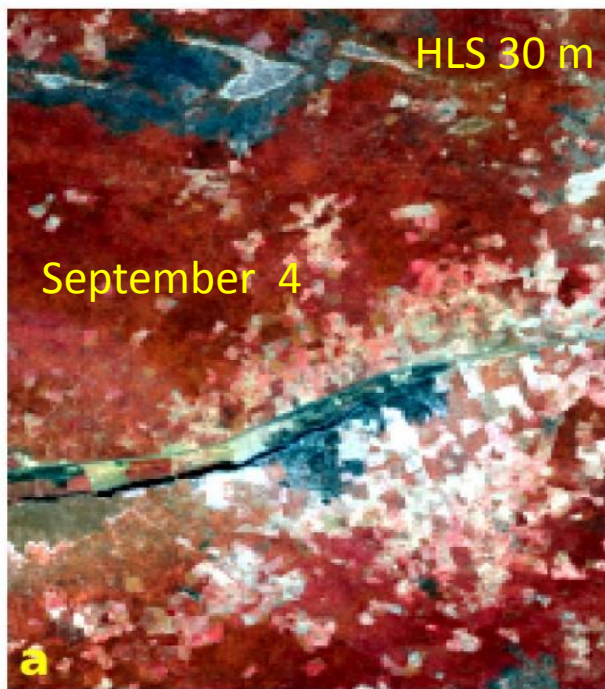


# Deep learning burned area classification



25 km × 11.5 km, 3m pixels

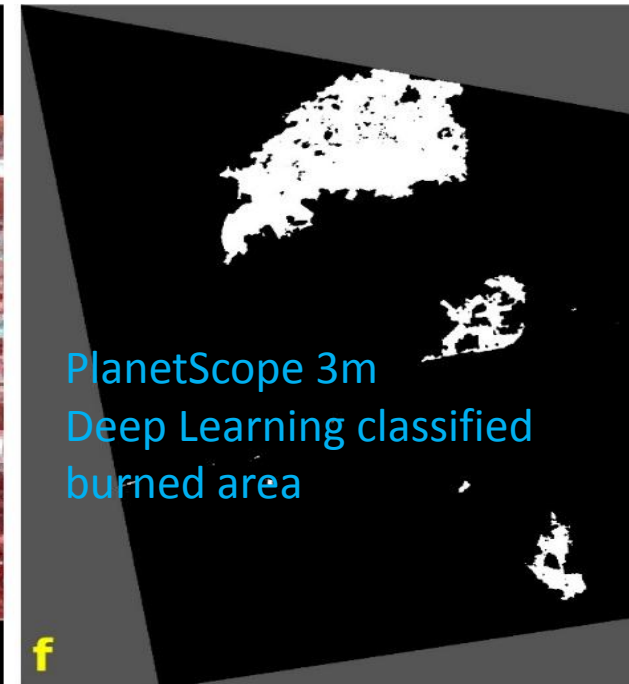
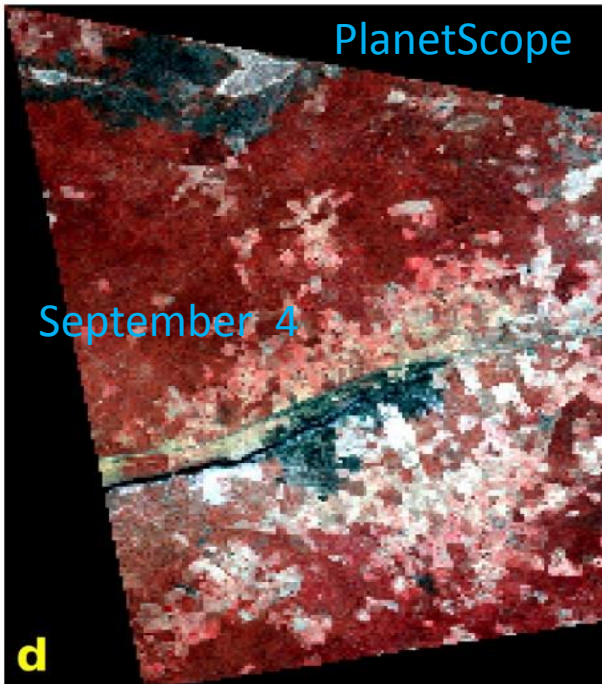
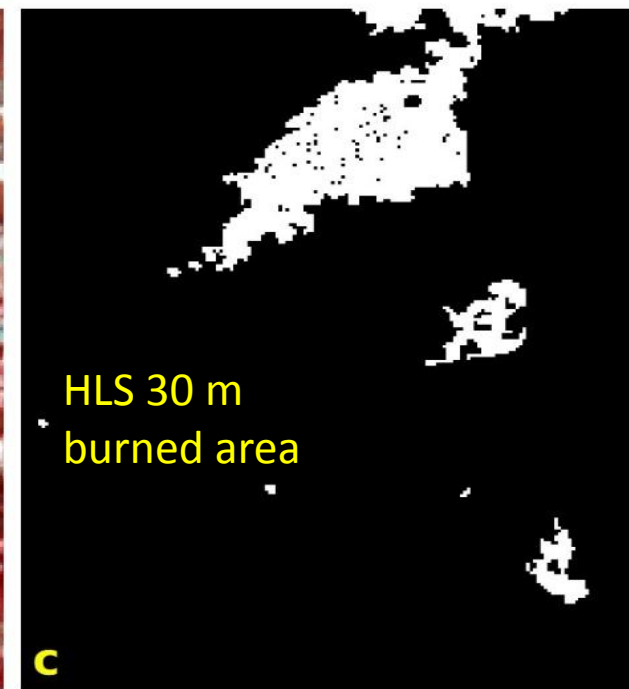
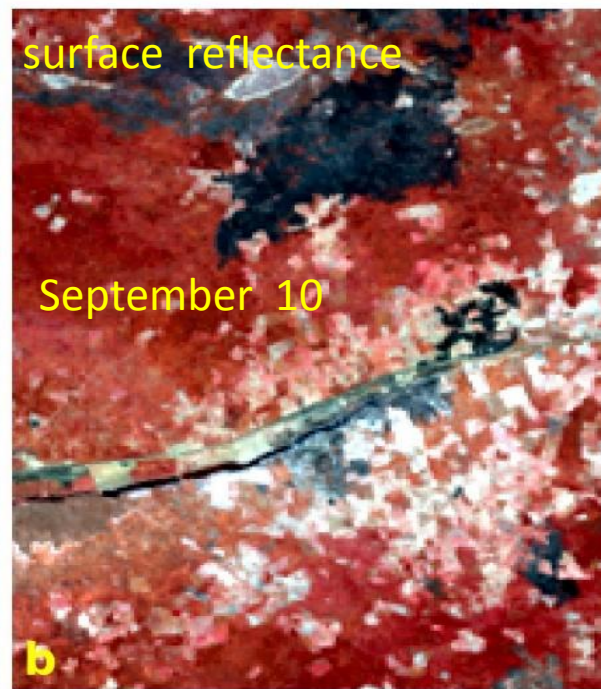
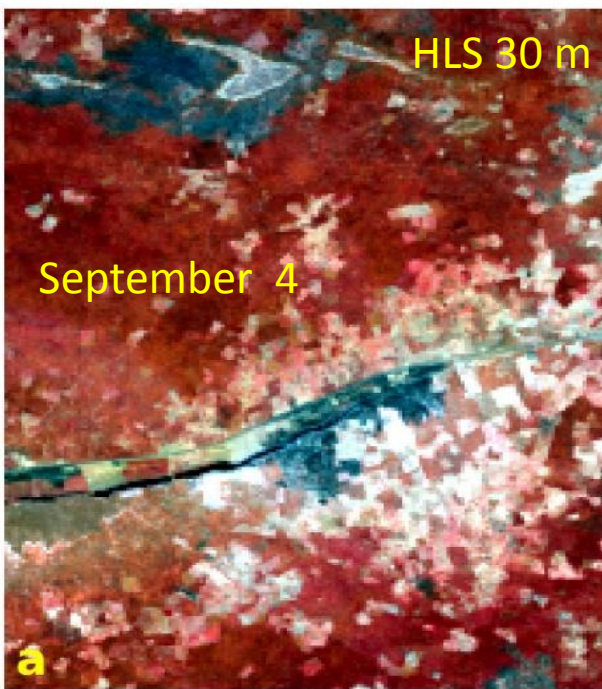
Detailed HLS  
burned area  
validation  
example



6.9 x 5.3 km  
Moxico  
province,  
Angola



Detailed HLS  
burned area  
validation  
example



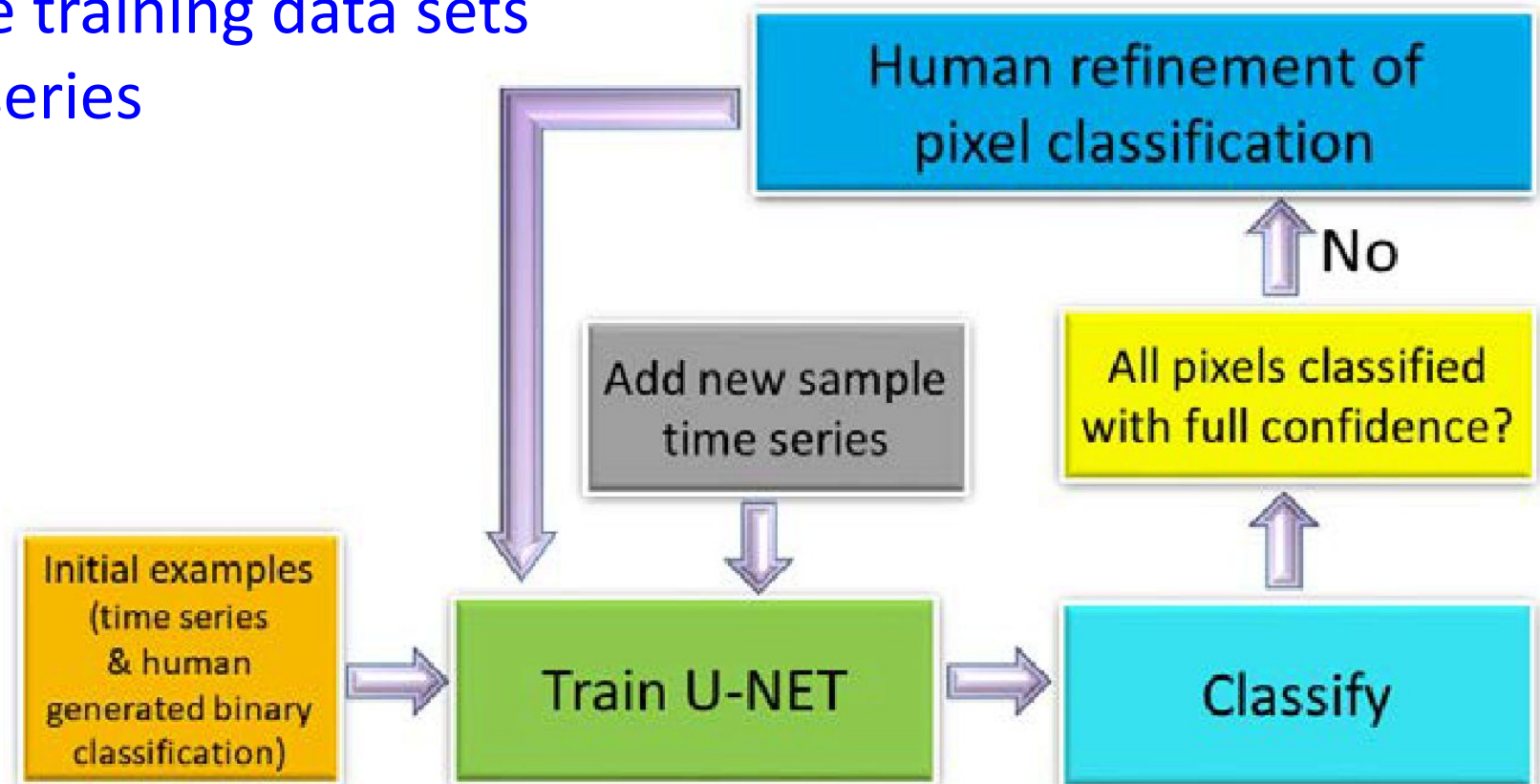
6.9 x 5.3 km  
Moxico  
province,  
Angola



# This year we updated the Deep Learning Model with active learning derived training data

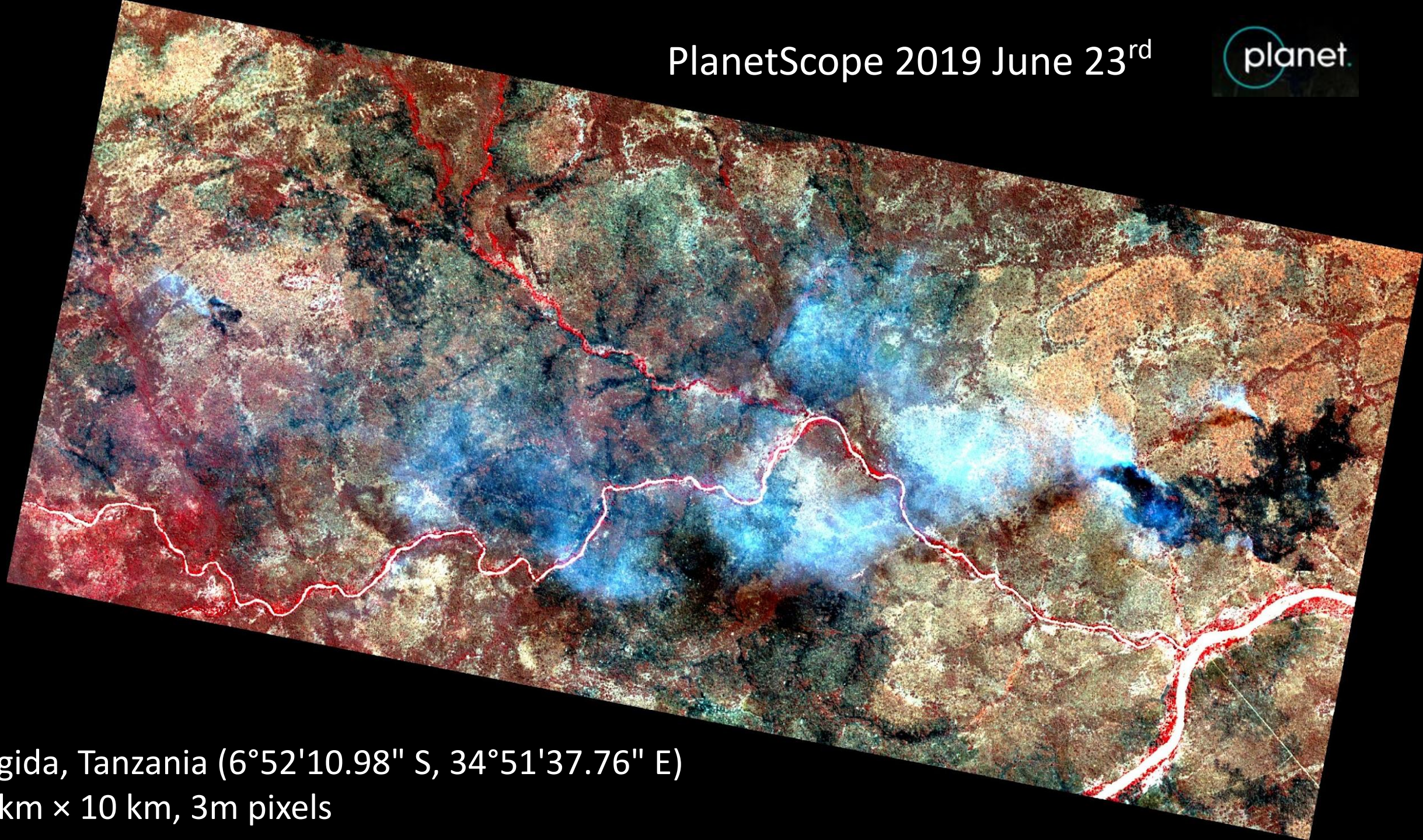
Use active learning / deep learning to efficiently derive large training data sets from PlanetScope time series

**NASA ACCESS**





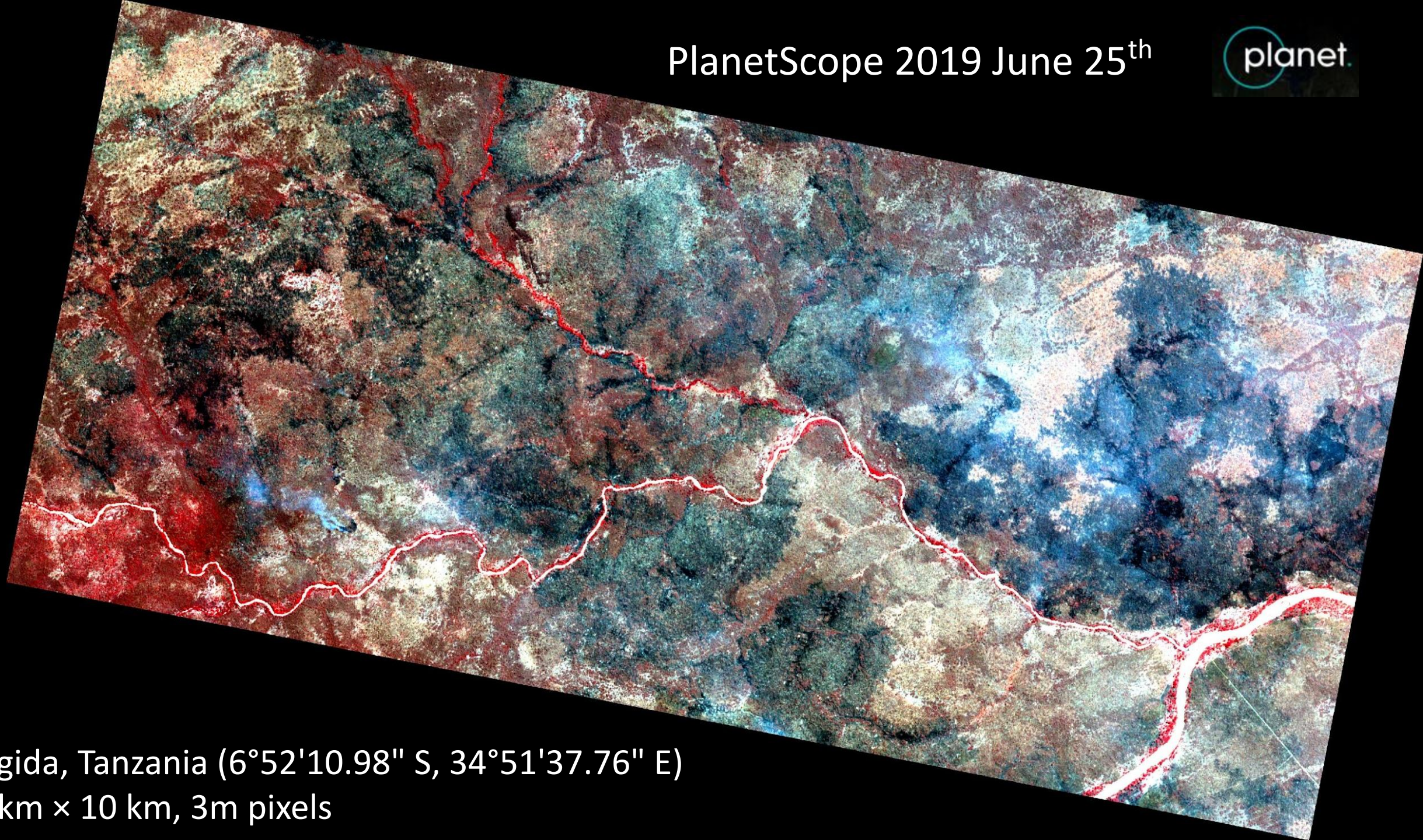
PlanetScope 2019 June 23<sup>rd</sup>



Singida, Tanzania (6°52'10.98" S, 34°51'37.76" E)  
17 km × 10 km, 3m pixels



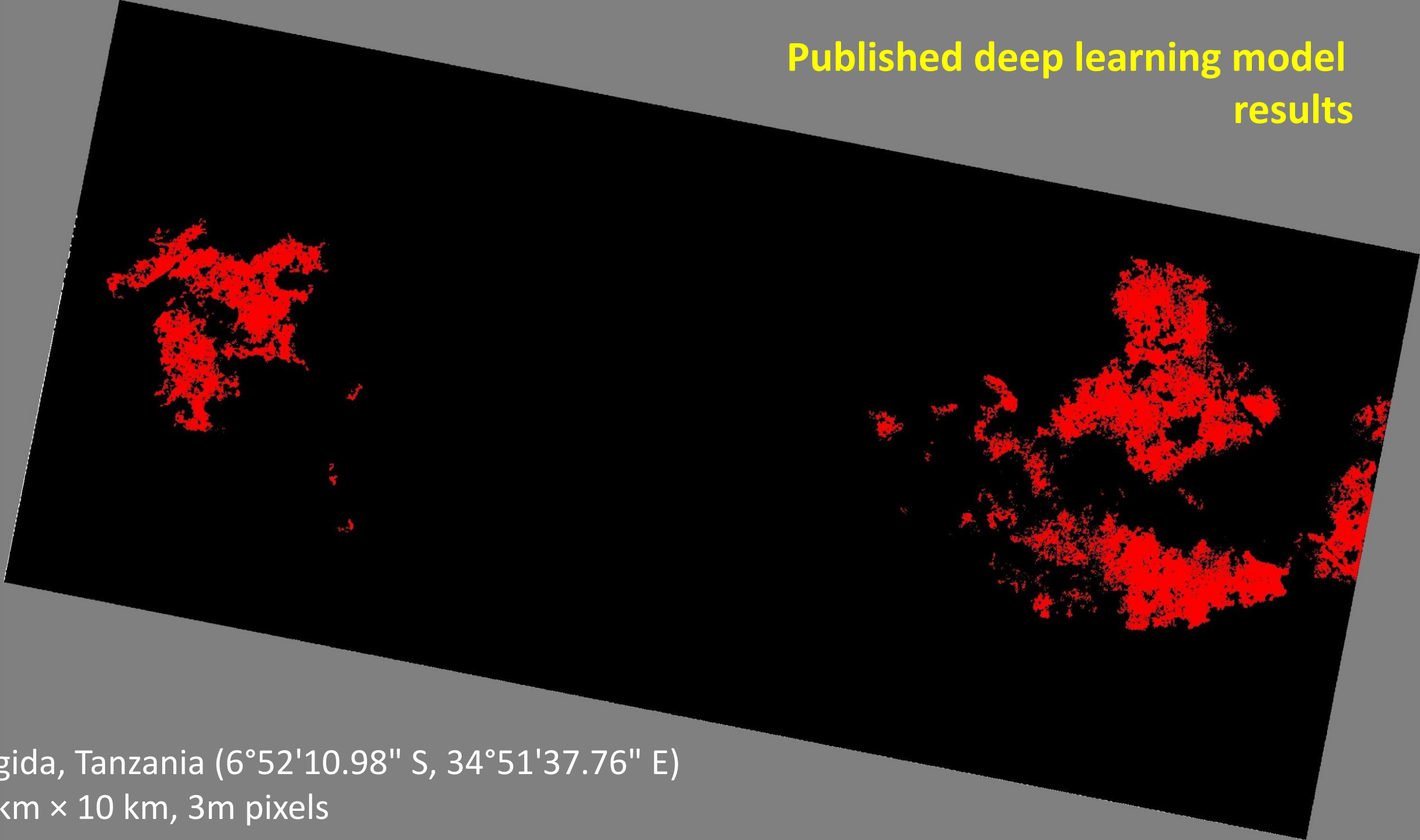
PlanetScope 2019 June 25<sup>th</sup>



Singida, Tanzania (6°52'10.98" S, 34°51'37.76" E)  
17 km × 10 km, 3m pixels



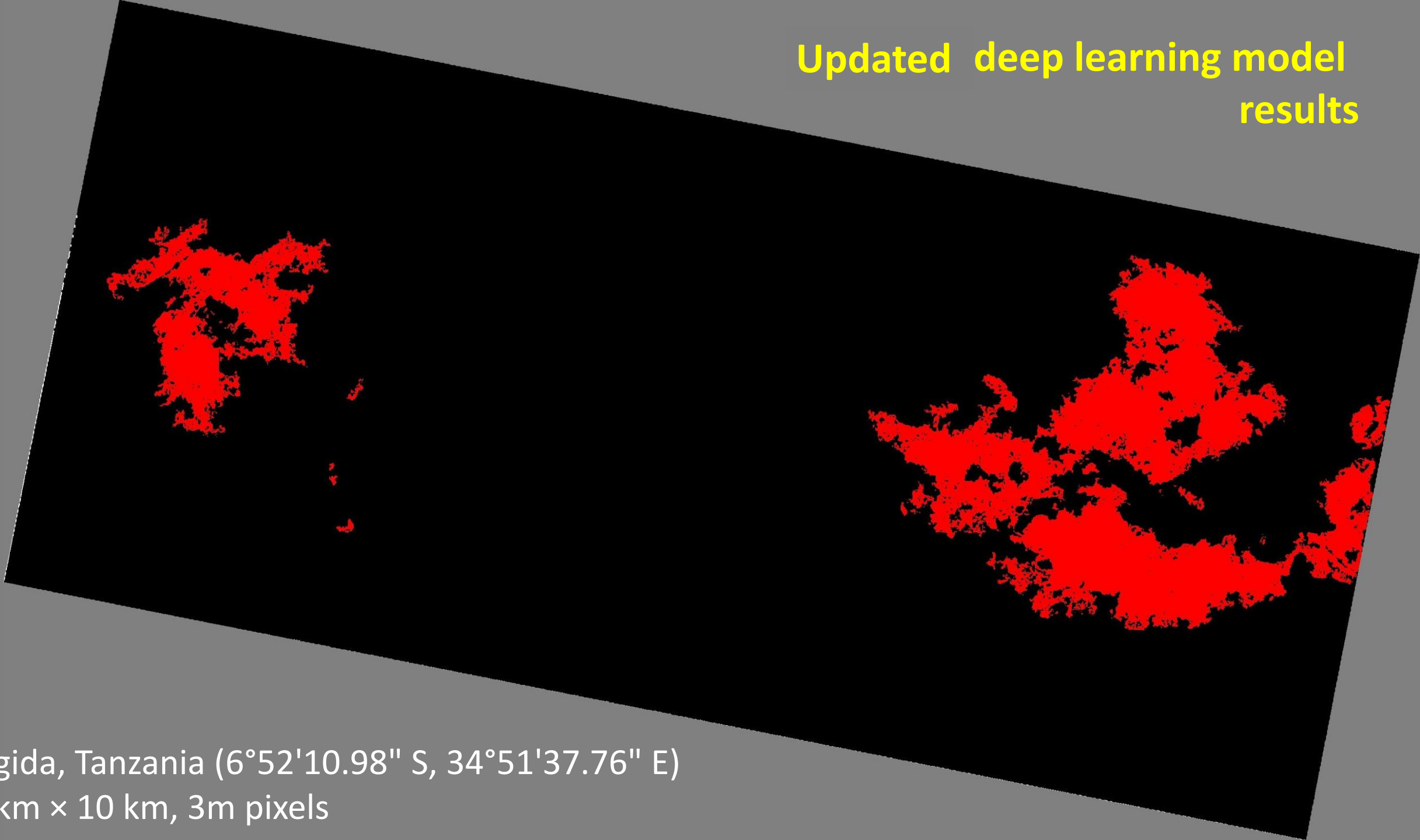
Published deep learning model  
results



Singida, Tanzania ( $6^{\circ}52'10.98''$  S,  $34^{\circ}51'37.76''$  E)  
17 km  $\times$  10 km, 3m pixels



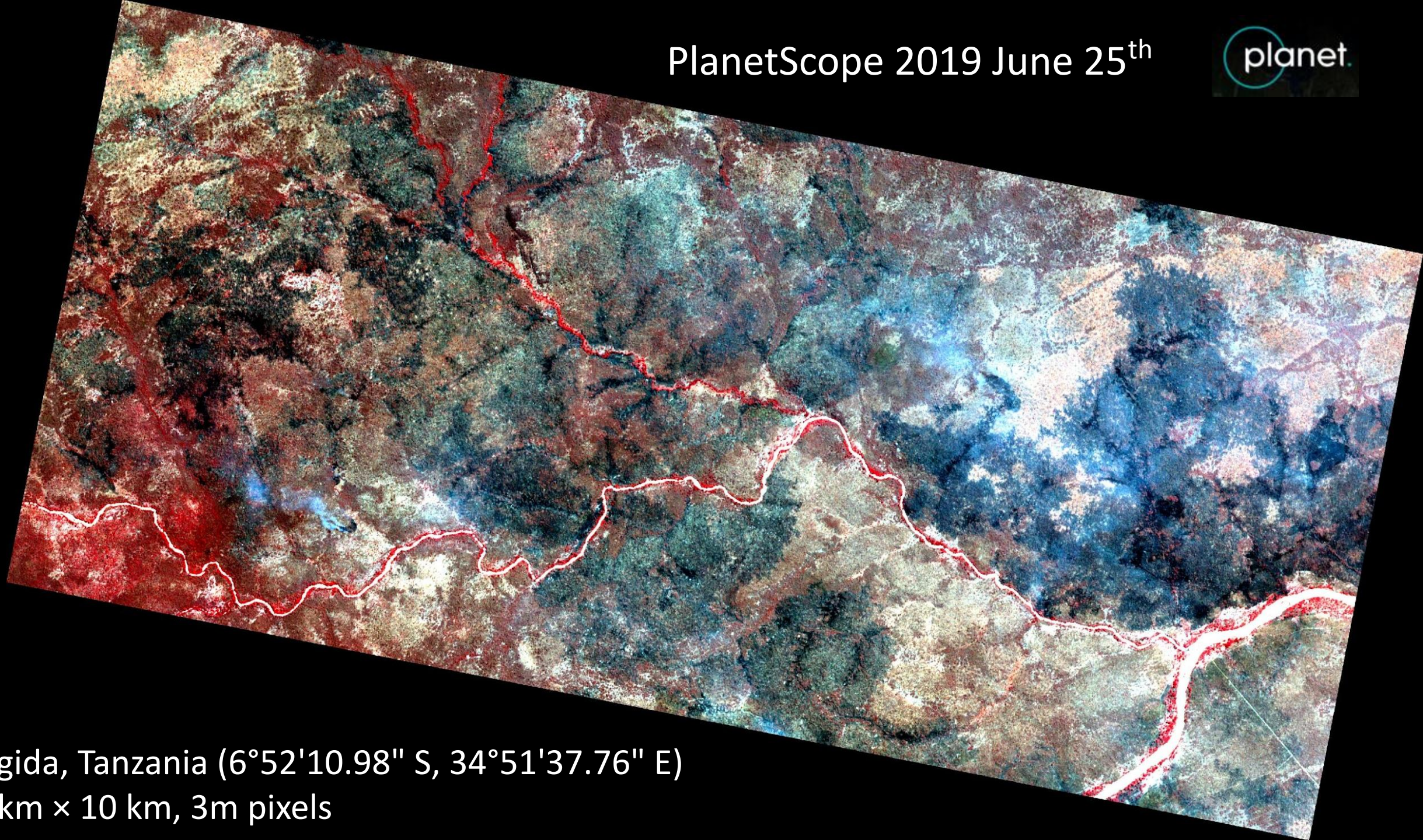
Updated deep learning model  
results



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17 km  $\times$  10 km, 3m pixels



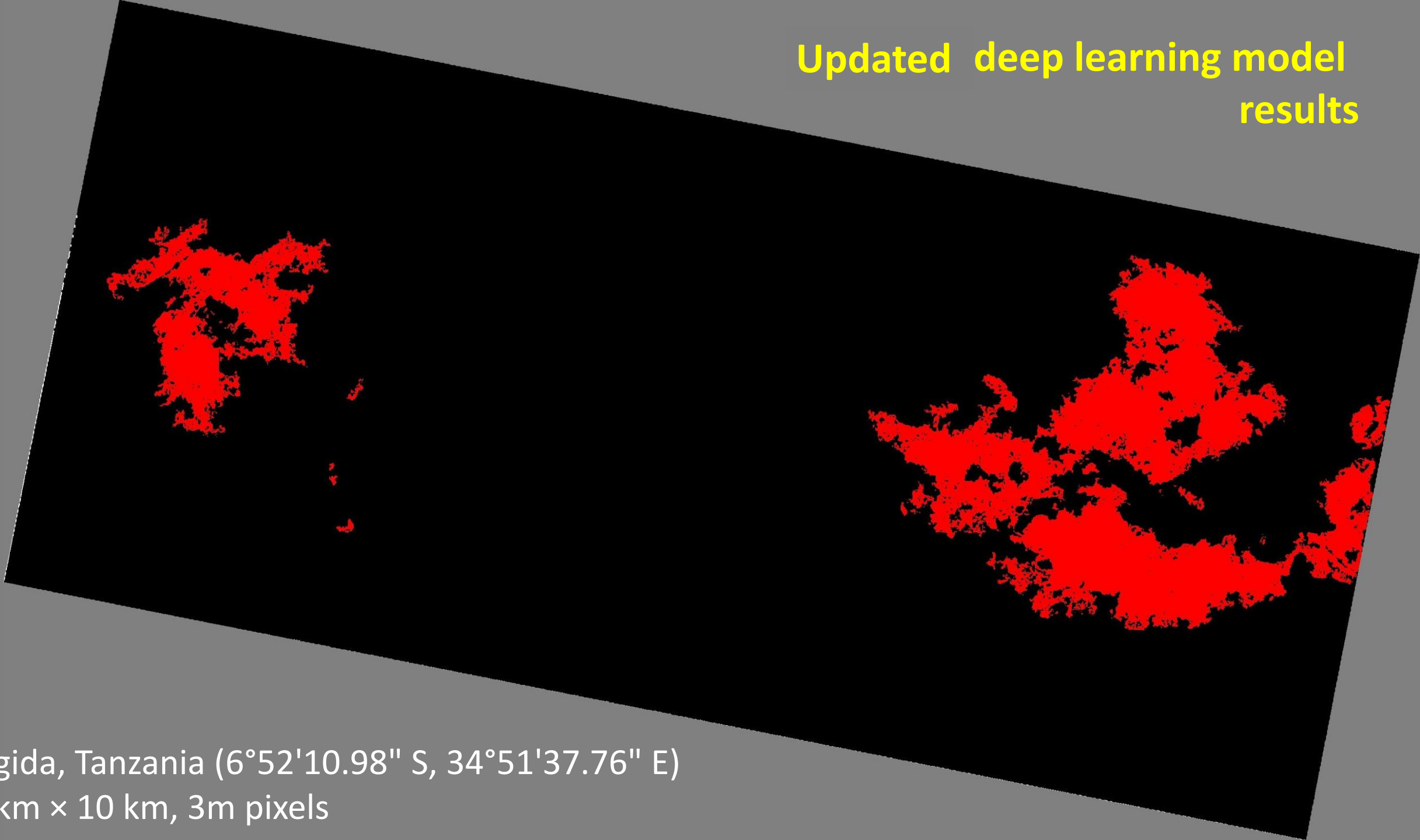
PlanetScope 2019 June 25<sup>th</sup>



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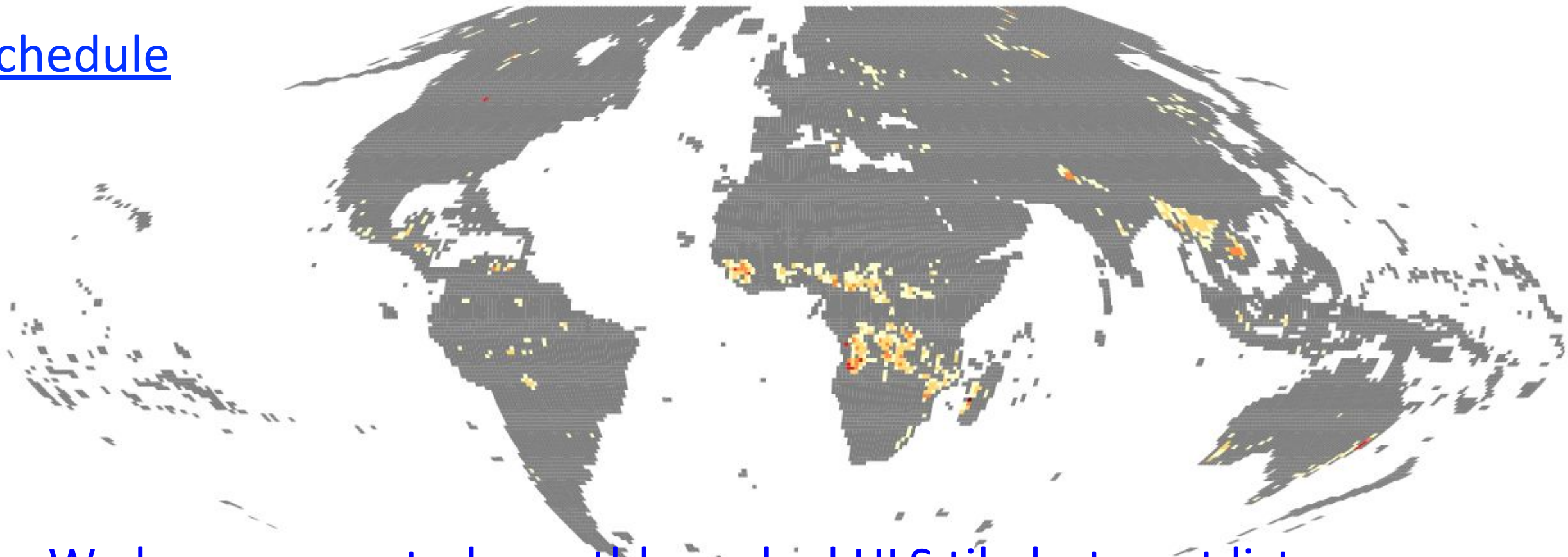


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- **Task #4** Provide the hot-spot 30 m burned area maps and 3 m PlanetScope validation data to the public. **At project end**

## Schedule



- We have generated monthly ranked HLS tile hot-spot lists
- Currently searching through the entries considering the highest ranked (i.e. greatest incidence of VIIRS 375 m active fire detections outside of MODIS 500 m burned areas) to find locations where both HLS and PlanetScope imagery are available



# Where are the Missing Burned Areas?

## Global Hotspots of Burned Area - A Multiresolution Analysis

- **Task #1** Identify global hot-spots of burned areas, specifically where the burns are missing at MODIS 500 m resolution. **Done**
- **Task #2** Map the burned area in the identified hot-spots at 30 m resolution. **Capability Done**
- **Task #3** Validate the 30 m burned area hot-spot mapping results using contemporaneous 3m PlanetScope data. **Capability Done**
- **Task #4** Provide the hot-spot 30 m burned area maps and 3 m PlanetScope validation data to the public. **At project end**
- **Task #5** Quantify the global MODIS 500 m burned area product underestimation due to its omission of small burns. **Exciting**  
**pay off**

# Where are the Missing Burned Areas?

## Global Hotspots of Burned Area - A Multiresolution Analysis

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THANKS

