Progress on Moving Multi-Source Land Imaging of Africa area burned to production

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2019 NASA LCLUC Spring Science Team Meeting, Rockville MD, April 9-11 2019



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Deadliest fires in CA history

Camp Fire

MODIS satellite image November 9 2018

Woolsey Fire

Fire and Climate

Wildfires cause ~35% of all global carbon emissions

Inter-annual variability in emissions linked primarily to rainfall variability

Estimated from the MODIS burned area product

	Fire emissions (10 ¹⁵ g C yr ⁻¹)
Central and northern South America	0.27
Southern South America	0.80
Northern Africa	0.80
Southern Africa	1.02
Southeast Asia	0.37
Boreal (north of 38°N)	0.14
Other	0.13
Global	3.53



MODIS Collection 6 500 m Burned Area Product Stage 3 Global Validation

L8 acquisition date 1 MAR 2014 20 MAR 2015

Locations of 558 Landsat two-date image pairs interpreted into burned, unburned, and unmapped classes

Boschetti, Roy, Giglio, Huang, Humber, Zubkova

Gobal Validation of the Collection 6 MODIS Burned Area Product

RSE, 2019, In Review.

MODIS Collection 6 500 m Burned Area Product Stage 3 Global Validation

Regression slope 0.815, intercept -0.003 ($r^2 = 0.82$)



New Global moderate resolution era Landsat 8, 9, 10



ESA Sentinel 2A & 2B



Planned Production - all of Africa, including Madagascar, south of the Tropic of Cancer (23.44° N) for 2017 / 2018 / 2019 process on NASA funded AWS









Sentinel-2

True color Surface reflectance

FILO Composite

7 S2 L1C tiles

5295 x 5295 30m pixels



Sentinel-2

True color Surface NBAR

FILO Composite

7 S2 L1C tiles

5295 x 5295 30m pixels

NBAR c-factor method

 $\mathsf{NBAR}_{\lambda} \left(\theta_{\mathsf{nadir}}, \theta_{\mathsf{fixed}} \right) = \mathbf{c} \ \rho_{\lambda} \left(\theta_{\mathsf{obs}} \phi_{\mathsf{obs}}, \theta_{\mathsf{sun}} \phi_{\mathsf{sun}} \right)$

$$\mathbf{c} = \frac{\hat{\rho}_{\lambda} (\theta_{\text{nadir}}, \theta_{\text{fixed}})}{\hat{\rho}_{\lambda} (\theta_{\text{obs}} \phi_{\text{obs}}, \theta_{\text{sun}} \phi_{\text{sun}})}$$

 $\hat{\rho}_{\lambda}$ computed from fixed global average MODIS BRDF/Albedo product (MCD43) spectral BRDF model parameters

Roy, D.P., Zhang, H. K., Ju, J., Gomez-Dans, J. L., Lewis, P.E., Schaaf C.B., Sun, Q., Li, J., Huang, H., Kovalskyy, V., 2016, A general method to normalize Landsat reflectance data to nadir BRDF adjusted reflectance, Remote Sensing of Environment, 176, 255-271.

Roy, D.P, Li, J., Zhang, H.K., Yan, L., Huang, H., 2017, Examination of Sentinel-2A multi-spectral instrument (MSI) reflectance anisotropy and the suitability of a general method to normalize MSI reflectance to nadir BRDF adjusted reflectance, Remote Sensing of Environment. 199, 25-38.

Sentinel-2A 10 days 2016



Sentinel-2A 10 days January 2016 (Solar Principal Plane) Swath overlap NIR ρ difference V view zenith



Sentinel-2A 10 days January 2016 Swath overlap NIR ρ difference V view zenith



View Zenith (°)

Radiance/reflectance measured by a sensor also changes with the sun's position



(Susan Ustin)

12 months of global Landsat solar zenith (θ_s) plotted as a function of scene center latitude & day of year



Zhang, H. K., Roy, D.P., Kovalskyy, V., 2016, Optimal solar geometry definition for global long term Landsat time series bi-directional reflectance normalization, *IEEE Transactions on Geoscience and Remote Sensing*. 54(3), 1410-1418.

HLS V1.4 modelled solar zenith function of latitude only

Claverie, M., Ju, J., Masek, J. G., Dungan, J. L., Vermote, E. F., Roger, J. C., ... & Justice, C. (2018). The Harmonized Landsat and Sentinel-2 surface reflectance data set. *Remote Sensing of Environment*, 219, 145-161.



Derived using a six degree polynomial function of latitude:

Li modelled solar zenith

function of latitude & day of year

Li, Z., Zhang, H.K., Roy, D.P., 2019, Investigation of Sentinel-2 bidirectional reflectance hot-spot sensing conditions. *IEEE Transactions on Geoscience and Remote Sensing*. DOI: 10.1109/TGRS.2018.2885967

Derived using sensor overpass time model (& astronomical model):

$$= \begin{cases} 10.5 - \frac{\arcsin\left(\frac{\tan(\varphi_{\text{nadir}})}{\tan(i)}\right)}{15}, & \text{in the descending orbit} \\ 22.5 + \frac{\arcsin\left(\frac{\tan(\varphi_{\text{nadir}})}{\tan(i)}\right)}{15}, & \text{in the ascending orbit} \end{cases}$$
(4)

where 10.5 (10:30 am) is the Sentinel-2 Local Time at Descending Node (for Landsat 10:11 am), φ_{nadir} is the nadir latitude, *i* is the satellite inclination angle (Sentinel-2 98.62°; Landsat-8 98.2°)

A year of view zenith angles (for a single pixel in South Africa)



A year of solar zenith angles (for a single pixel in South Africa)



NIR reflectance (for a single pixel in South Africa)



NIR NBAR - fixed HLS 1.4 solar zenith (for a single pixel in South Africa)



NIR NBAR – observed solar zenith (for a single pixel in South Africa)



NIR NBAR – local modelled solar zenith (for a single pixel in South Africa)



WELD Landsat 5 & 7 observed Solar Zenith



Global WELD NEX Version 3.0 September 2009 30m product from 15,058 L1T scenes (7,328 Landsat 5 & 7,730 Landsat 7)

Sinusoidal Equal Area Projection

WELD Landsat 5 & 7 modeled Solar Zenith used to derive WELD NBAR



Global WELD NEX Version 3.0 September 2009 30m product from 15,058 L1T scenes (7,328 Landsat 5 & 7,730 Landsat 7)

Sinusoidal Equal Area Projection

Sentinel-2 Landsat-8 Pre-Processing

- Global WELD processing framework
 - Tiling into MODIS sinusoidal grid
 - Sentinel-2A to Landsat-8 registration
 - Sentinel-2A to Sentinel-2A registration
- Atmospheric correction (LaSRC)
- Nadir BRDF-adjusted reflectance (NBAR) (MODIS c-factor)
- Masking
 - cloud (Landsat 8 Collection 1 & Sen2Cor masks)
 - no masking of shadow

Evaluation of Landsat-8 and Sentinel-2A aerosol optical depth retrievals across Chinese cities and implications for medium spatial resolution urban aerosol monitoring, Li, Z., Roy, D.P., Zhang, H.K., Vermote, E.F., Huang, H., 2019, Remote Sensing. 11(2), 122.

V3.5.5 LaSRC AOD retrieval

All urban AERONET sites in China, +/- 10 minute overpass, Level 2 AERONET



Southern Africa

Landsat 8 Collection 1 June 4 – 10 2016 (7 days) 5295 × 5295 30m WELD tiles sinusoidal projection

Southern Africa

N **Sentinel 2A** June 4 – 10 2016 (7 days) 5295 × 5295 30m WELD tiles sinusoidal projection Report



Landsat-8 **Sentinel-2A** statistical calibration Zhang, Roy, Yan, Li, Huang, Vermote, Skakun, Roger, 2018, RSE, Characterization of Sentinel-2A and

Characterization o Sentinel-2A and Landsat-8 top of atmosphere, surface, nadir BRDF adjusted reflectance and NDVI differences To first order the change in reflectance due to burning is dependent on the fraction of area burned *f* and combustion completeness *cc*



Landsat 8

Kafue National park, Zambia

Day 155 2016

false color surface NBAR

2000 x 2000 30m pixels



Sentinel 2A

Kafue National park, Zambia

Day 164 2016

false color surface NBAR

2000 x 2000 30m pixels



f x cc day 155 -> 164



2000 x 2000 30m pixels
Example results

July 19th 2016

~2200 nm 1600 nm 865 nm

MODIS tile h20v10

7 x 7 WELD tiles



July 19th 2016

~2200 nm 1600 nm 865 nm

MODIS tile h20v10

7 x 7 WELD tiles



Landsat 8

Day 183 2016 July 1st

2200 nm 1600 nm 865 nm

Angola, Lunda Sul Province



Day 183 2016 July 1st

2190 nm 1610 nm 865 nm

Angola, Lunda Sul Province



Landsat 8

Day 190 2016 July 8th

2200 nm 1600 nm 865 nm

Angola, Lunda Sul Province

Day 190 2016 July 8th

2190 nm 1610 nm 865 nm

Angola, Lunda Sul Province



Landsat 8

Day 192 2016 July 10th

2200 nm 1600 nm 865 nm

Angola, Lunda Sul Province

Day 193 2016 July 11th

2190 nm 1610 nm 865 nm

Angola, Lunda Sul Province



Landsat 8

Day 199 2016 July 17th

2200 nm 1600 nm 865 nm

Angola, Lunda Sul Province



Day 200 2016 July 18th

2190 nm 1610 nm 865 nm

Angola, Lunda Sul Province



Day 203 2016 July 21st

2190 nm 1610 nm 865 nm

Angola, Lunda Sul Province



Day 213 2016 July 31st

2190 nm 1610 nm 865 nm

Angola, Lunda Sul Province



Number of cloud-free observations July 2016 Landsat 8

Angola, Lunda Sul Province

Number of cloud-free observations July 2016 Sentinel-2A

Angola, Lunda Sul Province



Number of cloud-free observations July 2016 Landsat-8 Sentinel-2A

3

4

5

>7

median 6

Angola, Lunda Sul Province



Day of burning July 2016 Sentinel-2A

0-2 3-5 6-8 9-11 12-14 15-17 18-20 21-23 24-27 28-31 Angola, Lunda Sul Province



Day of burning July 2016 Sentinel-2A Landsat-8

0-2 3-5 6-8 9-11 12-14 15-17 18-20 21-23 24-27 28-31 Angola, Lunda Sul Province



f x cc July 2016 Sentinel-2A

> $0.2 \le f.cc < 0.4$ $0.4 \le f.cc < 0.6$ $0.6 \le f.cc < 0.8$ $0.8 \le f.cc < 0.9$ $0.9 \le f.cc \le 1.0$

Angola, Lunda Sul Province



f x cc July 2016 Sentinel-2A Landsat-8

> $0.2 \le f.cc < 0.4$ $0.4 \le f.cc < 0.6$ $0.6 \le f.cc < 0.8$ $0.8 \le f.cc < 0.9$ $0.9 \le f.cc \le 1.0$

Angola, Lunda Sul Province





MODIS tile h20v10

7 x 7 WELD tiles

Number of cloud-free observations July 2016 Landsat 8

1112 x 1112 km

Number of cloud-free observations July 2016 Sentinel-2A

1112 x 1112 km



Number of cloud-free observations July 2016 Landsat 8 Sentinel-2A

1

1112 x 1112 km



Day of burning Sentinel-2A Landsat-8 July 2016



1112 x 1112 km



Day of burning MODIS 500m MCD64 C6 July 2016

6-8
9-11
12-14
15-17
18-20
21-23
24-27
28-31

1112 x 1112 km



Confusion matrix for July 2016 results

		MODIS MCD64 C6 (assumed to be truth)			Row total km ²
		Burned km ²	Unburned km ²	Unmapped km ²	
	Burned	3,9871	72,428	154	112,454
	km²	(3.2%)	(5.9%)	(<0.1%)	(9.1%)
Landsat-8/	Unburned	25,283	1,086,069	2,620	1,113,972
Sentinel-2A	km²	(2.0%)	(87.8%)	(0.2%)	(90.1%)
	Unmapped	15	2,430	7,561	10,006
	km²	(<0.01%)	(0.2%)	(0.6%)	(0.8%)
Column total		65,170	1,160,926	10,336	1,236,433
[km²		(5.3%)	(93.9%)	(0.8%)	(100.0%)

Omission Error (0-1) = 0.64; Commission Error (0-1) = 0.39; Relative Bias [%] = - 41.9% User's Accuracy (0-1) = 0.61; Producer's Accuracy (0-1) = 0.36; Overall Accuracy (0-1) = 0.91

Comparison of July 2016 burned proportions mapped by MODIS and Landsat-8 & Sentinel-2



Comparison of July 2016 burned proportions mapped by MODIS and Landsat-8 & Sentinel-2



Day of burning Sentinel-2A Landsat-8 July 2016

0-2 3-5 6-8 9-11 12-14 15-17 18-20 21-23 24-27 28-31 Angola, Lunda Sul Province



Day of burning MODIS 500m MCD64 July 2016

0-2 3-5 6-8 9-11 12-14 15-17 18-20 21-23 24-27 28-31 Angola, Lunda Sul Province



Day of burning Sentinel-2A Landsat-8 August 2016

0-2 3-5 6-8 9-11 12-14 15-17 18-20 21-23 24-27 28-31 Angola, Lunda Sul Province



Day of burning MODIS 500m MCD64 C6 August 2016 0-2 3-5 6-8 9-11 12-14 15-17 18-20 21-23 24-27 28-31 Angola, Lunda Sul Province

Day of burning Sentinel-2A Landsat-8 Sept. 2016

0-2 3-5 6-8 9-11 12-14 15-17 18-20 21-23 24-27 28-31 Angola, Lunda Sul Province



Day of burning MODIS 500m MCD64 C6 Sept. 2016

0-2 3-5 6-8 9-11 12-14 15-17 18-20 21-23 24-27 28-31 la, a Sul

Angola, Lunda Sul Province

Day of burning Sentinel-2A Landsat-8 Oct. 2016

0-2 3-5 6-8 9-11 12-14 15-17 18-20 21-23 24-27 28-31 Angola, Lunda Sul Province


Day of burning
MODIS
500m MCD64 C6
Oct. 2016

6-8			
9-11			
12-14			
15-17			
18-20			
21-23			
24-27			
Angola, 28-31			
Lunda Sul			
Province			

159 x 159 km 5295 x 5295 30m pixels Day of burning MODIS 1km active fires Oct. 2016



Day of burning Sentinel-2A Landsat-8 Oct. 2016

0-2 3-5 6-8 9-11 12-14 15-17 18-20 21-23 24-27 28-31 Angola, Lunda Sul Province

159 x 159 km 5295 x 5295 30m pixels



July temporal product reporting difference (days)



Landsat-8 Sentinel-2 Day of burning - MODIS Day of burning

Comparison of July 2016 burned proportions mapped by MODIS and Landsat-8 & Sentinel-2



Comparison of July 2016 burned proportions mapped by MODIS and Landsat-8 & Sentinel-2 with 3-day adjustment



Day of burning Sentinel-2A Landsat-8 July 2016



1112 x 1112 km



Day of burning Sentinel-2A Landsat-8 August 2016



1112 x 1112 km



Day of burning Sentinel-2A Landsat-8 Sept. 2016

> 0-2 3-5 6-8 9-11 12-14 15-17 18-20 21-23 24-27 28-31

1112 x 1112 km



Day of burning Sentinel-2A Landsat-8 Oct. 2016

> 0-2 3-5 6-8 9-11 12-14 15-17 18-20 21-23 24-27 28-31

1112 x 1112 km



Day of burning MODIS 500m MCD64 C6 July 2016

6-8
9-11
12-14
15-17
18-20
21-23
24-27
28-31

1112 x 1112 km



Day of burning MODIS 500m MCD64 C6 August 2016

6-8
9-11
12-14
15-17
18-20
21-23
24-27
28-31

1112 x 1112 km



Day of burning MODIS 500m MCD64 C6 Sept 2016

6-8
9-11
12-14
15-17
18-20
21-23
24-27
28-31

1112 x 1112 km



Day of burning MODIS 500m MCD64 C6 Oct 2016

0-2 3-5 6-8 9-11 12-14 15-17 18-20 21-23 24-27 28-31

1112 x 1112 km



Validation

July 2016

August 2016

Sentinel-2A Landsat-8 30 m

 $0.2 \le f.cc < 0.4$ $0.4 \le f.cc < 0.6$ $0.6 \le f.cc < 0.8$ $0.8 \le f.cc < 0.9$ $0.9 \le f.cc \le 1.0$

Zambia

1.8 km × 3.6 km

60 × 120 30 m pixels



July18

August 18



3 m false color (0.82, 0.63, 0.54 μm)



Zambia

1.8 km × 3.6 km

600 × 1200 3 m pixels

July 2016 August 2016 е

Sentinel-2A Landsat-8 30 m

Mapped:

< July 18

July 18 - August 18

> August 18

Zambia

1.8 km × 3.6 km

60 × 120 30 m pixels

July18

August 18



3 m false color (0.82, 0.63, 0.54 μm)



1.8 km × 3.6 km

600 × 1200 3 m pixels



Sentinel-2A Landsat-8 30 m

 $0.2 \le f.cc < 0.4$ $0.4 \le f.cc < 0.6$ $0.6 \le f.cc < 0.8$ $0.8 \le f.cc < 0.9$ $0.9 \le f.cc \le 1.0$

Zambia

1.8 km × 3.6 km

60 × 120 30 m pixels



Sentinel-2A Landsat-8 30 m

Mapped:

< July 18

July 18 - August 18

> August 18

Zambia

1.8 km × 3.6 km

60 × 120 30 m pixels



Sentinel-2A false color

surface NBAR July 2nd 2016 swath





overall accuracy commission error the omission error

1112 x 1112 km



		Landsat-8/Sentinel-2A				
		Burned [km ²]	Unburned [km ²]	Unmapped [km ²]	Row total [km ²]	
	Burned [km ²]	1203.94 (11.13%)	378.03 (3.50%)	0.00 (<0.01%)	1581.97 (14.63%)	
Reference	Unburned [km ²]	73.39 (0.01%)	9152.43 (84.68%)	0.05 (<0.01%)	9225.87 (84.69%)	
	Unmapped [km ²]	0.00 (0.00%)	0.01 (<0.01%)	0.00 (0.00%)	0.01 (<0.01%)	
	Column total [km ²]	1277.33 (11.14%)	9530.47 (88.18%)	0.05 (<0.01%)	10807.80	

Omission Error (0-1) = 0.24Commission Error (0-1) = 0.06Relative Bias [%] = -0.19User's Accuracy (0-1) = 0.94Producer's Accuracy (0-1) = 0.76Overall Accuracy (0-1) = 0.96

Comparison of July 2016 burned proportions mapped by reference and Landsat-8 & Sentinel-2



Validate cc in field with international collaborators ?



10th Southern African Fire Network (SAFNet) Meeting 17th - 19th April 2018

Venue: Kruger National Park, Skukuza, South Africa

Collaborative fire information, resource sharing, training and research in support of Integrated Fire Management in Southern African countries

Too green to burn !



Kruger National Park, South Africa, October 2018 – drier !



TLS Pre fire

TLS Post fire

Planned Production - all of Africa, including Madagascar, south of the Tropic of Cancer (23.44° N) for 2017 / 2018 / 2019 process on NASA funded AWS



Summary

- New moderate resolution data will provide global burned area mapping capability
 - Exciting
 - Improved reporting of small and spatially fragmented burned areas
 - Need S2A and L8 for reliable burned area mapping, L8 alone insufficient
 - S2A, S2B & L8 will be optimal
- Major R&D effort on Sentinel-2 and Landsat-8 pre-processing
 - will use HLS V1.5 this Fall (improved cloud mask, correct c-factor implementation)
- Automated burned area algorithm protoyped
 - applied to NBAR surface reflectance gridded WELD tile time series
 - only 2 parameters
 - map 30m burned area + sub-pixel fraction (f) x combustion completeness (cc)
 - *Remote Sensing of Environment*, paper currently in review (round 3 !)
- Planned production
 - all of Africa, including Madagascar, south of the Tropic of Cancer
 - 2017 (S2A & L8), 2018 (S2A, S2B, L8), 2018 (S2A, SB, L8)
- Validation
 - Commercial data (burned area, f) & perhaps in situ Terrestrial Laser Scanner (cc)