



# Moving from Prototyping Multisource Imaging of Seasonal Dynamics in Land Surface Phenology to Production

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### Land Surface Phenology



#### Exploit temporal density of Landsat + Sentinel 2:

- To generate gap-filled time series of spectral vegetation indices that characterize the entire seasonal cycle of land surface phenology at fixed time steps.
- To quantify the timing and magnitude of land surface phenology events ("phenometrics") at moderate spatial resolution.

Heritage: MODIS Land Cover Min EVI Dynamics (MCD12Q2) Includes 7 metrics Onset of EVI increase, Max EVI ΣΕνι

Timing

igodol

- Onset of EVI maximum,
- Onset of EVI decrease,
- Onset of EVI minimum,
- Annual • Min, max, & sum of growing season EVI Metrics

# Heritage: Landsat Phenology Algorithm











Melaas et al., 2013, 2016

#### From Coarse to Moderate Spatial Resolution



# Operationalize a prototype moderate spatial resolution LSP algorithm at continental scale.

• To produce moderate spatial resolution land surface phenology data sets at continental scale that provide: **(1) the timing of phenological events**, **(2)** reduced dimension image data sets that maximize multispectral information and minimize temporal correlation in image time series, and **(3)** identify in-season anomalies in near real-time.

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- To perform validation and accuracy assessment, provide documentation related to the algorithm and the uncertainty associated with the product, and to work with the Land Processes Distributed Active Archive Center (LP-DAAC) to distribute the product to the user community.

#### Harmonized Landsat Sentinel-2 (HLS)

#### Sentinel-2A

- 10, 20 m spatial res.
- 10-day revisit
- Oct. 2015
  - present

#### <u>HLS</u>

- 30 m spatial res.
- 3- to 5-day revisit
- May 2013 present
- BRDF Normalized
- Cloud/Shadow Mask

#### Landsat 8

- 30 m spatial res.
- 16-day revisit
- May 2013 present

## Multisource Land Surface Phenology (MS-LSP)



Local vs. Global Fitting Methods: Splines, Double Logistic, Savitzky Golay

#### Pre-Procesing (1): Gap-Filling/Imputation via MICE (Multiple Imputation by Chained Equations)



#### Pre-Procesing(2): Topographic Corrections



### Spring Greenup, Coweeta, 2016







Sample Results

Cropland Dominated Landscapes

*16 HLS Tiles* 



Sample Results: Eastern Colorado



Blue: DoY 70 — March 10 Green: DoY 170 — June 18 Red: DoY 270 — Sept. 26 Sample Results: Eastern Colorado



Sample Results: Eastern Colorado





Blue: DoY 70 — March 10 Green: DoY 170 — June 18 Red: DoY 270 — Sept. 26







Sample Results: Kansas



Blue: DoY 70 — March 10 Green: DoY 170 — June 18 Red: DoY 270 — Sept. 26 Sample Results: Kansas



Sample Results: Kansas



## Operational MS-LSP Product

## Distributed via LP-DAAC



cience Data Set	SDS Description
Reference Date	Accounts for differences in seasonality across hemispheres; Jan 1, 2015 in Northern Hemisphere – see Timing Metrics below
Phenological Timing Metrics	
Onset Greenness Increase (OGI)	Date, number of days from Reference Date
50 Percent Greenness Increase (50PCGI)	Date, number of days from Reference Date
Onset Greenness Maximum (OGMx)	Date, number of days from Reference Date
Onset Greenness Decrease (OGD)	Date, number of days from Reference Date
50 Percent Greenness Decrease (50PCGD)	Date, number of days from Reference Date
Onset Greenness Minimum (OGMn)	Date, number of days from Reference Date
Integrated Greenness	Sum of daily EVI during growing season
HLS Reflectance Metrics	
HLS Reflectance on OGI Date	Bands 1-6 HLS surface reflectance on OGI date
HLS Reflectance on 50PCGI Date	Bands 1-6 HLS surface reflectance on 50PCGI date
HLS Reflectance on OGMx Date	Bands 1-6 HLS surface reflectance on OGMx date
HLS Reflectance on OGD Date	Bands 1-6 HLS surface reflectance on OGD date
HLS Reflectance on 50PCGD Date	Bands 1-6 HLS surface reflectance on 50PCGD date
HLS Reflectance on OGMn Date	Bands 1-6 HLS surface reflectance on OGMn date
LSP Mean and Anomaly Metrics	
Long Term Weekly Mean EVI	Average EVI across available years, at 7-day time steps; Available in 2019.
Weekly EVI Anomaly	In-season anomaly in EVI, relative to long-term mean, at 7-day time steps; Available in 2019.
Cumulative EVI Growing Season Anomaly	Sum of anomalies in daily interpolated EVI versus long-term mean at each pixel; Available in 2019.

#### Assessment:

## PhenoCams,

NPN







PhenoCam Spring Onset Bias (days)



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#### Next Steps

- HLS 2.0
- Addition of Sentinel 2B
- Continued prototyping and testing (semi arid, high-latitude systems, etc.)
- Deployment in production system
- Targeting release of VO Product in Q2 2019