

Automating the detection of disturbances to aquatic resources



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Project Motivation

- Global trends in wetland degradation and loss have created an urgency to:
 1. Monitor wetland extent and,
 2. Track the distribution and causes of wetland loss.
- Satellite imagery can be used to monitor wetlands over time.
- Few efforts have attempted to distinguish anthropogenic wetland loss from climate-driven variability in wetland extent.



Approach

- Tracked inundation extent and land cover disturbance across the Mid-Atlantic region using the Landsat archive in Google Earth Engine.
- How to best remotely detect anthropogenic wetland loss (due to land cover change)?
 - Decrease in inundation extent?
 - Disturbance extent?
 - Co-location of inundation decline and disturbance?

Article

Isolating Anthropogenic Wetland Loss by Concurrently Tracking Inundation and Land Cover Disturbance across the Mid-Atlantic Region, U.S.

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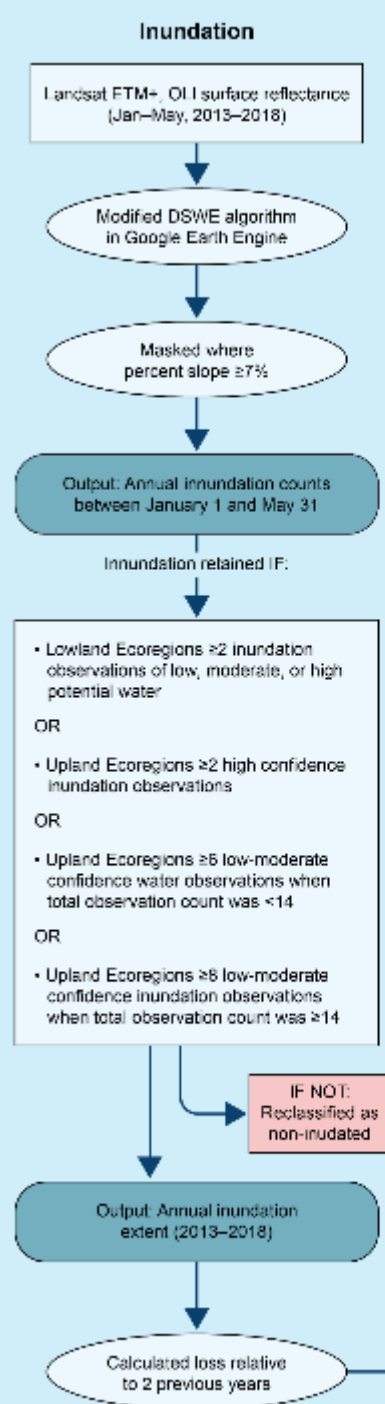
Received: 26 March 2020; Accepted: 1 May 2020; Published: 5 May 2020



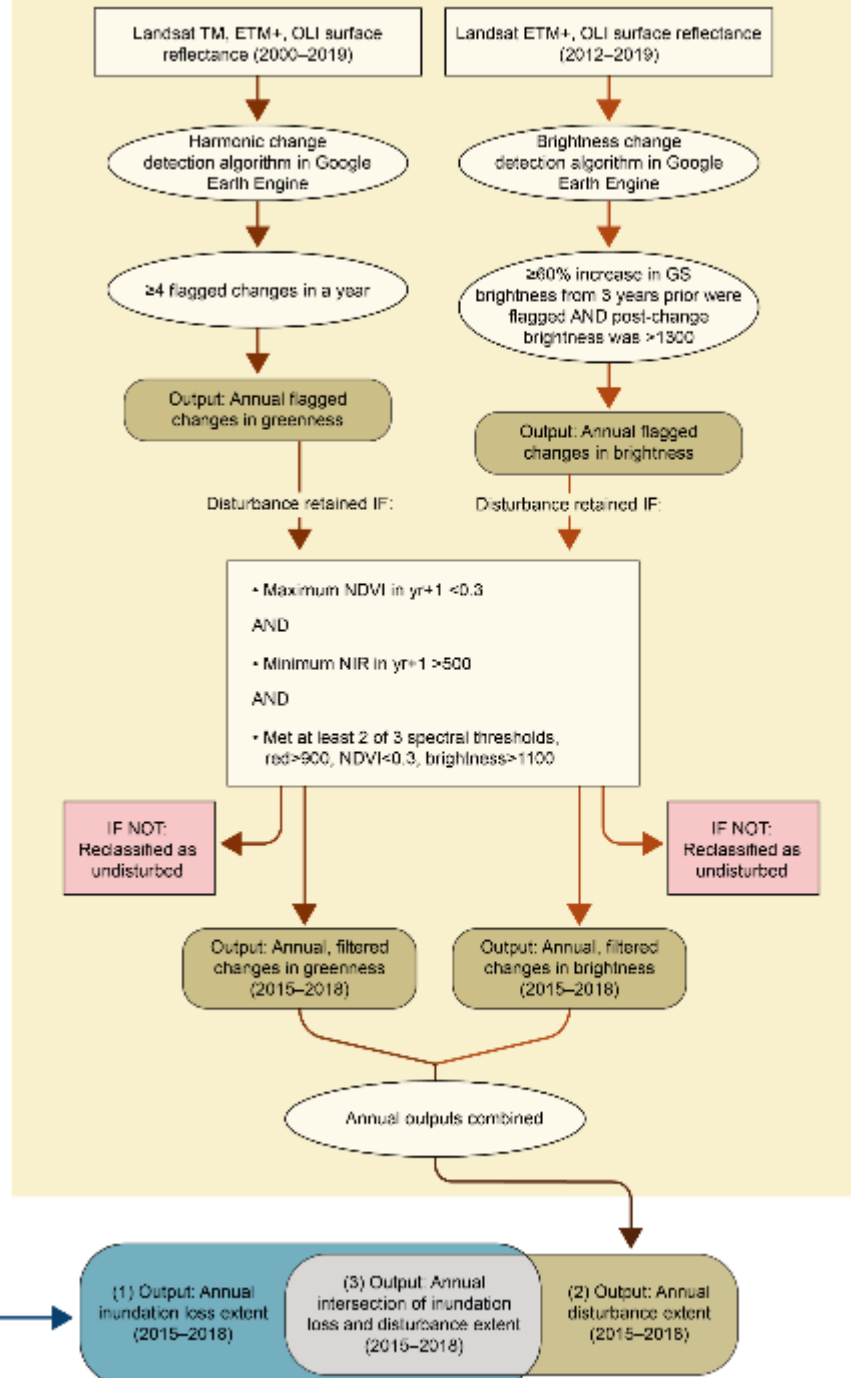
Abstract: Global trends in wetland degradation and loss have created an urgency to monitor wetland extent, as well as track the distribution and causes of wetland loss. Satellite imagery can be used to monitor wetlands over time, but few efforts have attempted to distinguish anthropogenic wetland loss from climate-driven variability in wetland extent. We present an approach to concurrently track land cover disturbance and inundation extent across the Mid-Atlantic region, United States, using the Landsat archive in Google Earth Engine. Disturbance was identified as a change in greenness, using a harmonic linear regression approach, or as a change in growing season brightness. Inundation extent was mapped using a modified version of the U.S. Geological Survey's Dynamic Surface Water Extent (DSWE) algorithm. Annual (2015–2018) disturbance averaged 0.32% (1095 km² year⁻¹) of the study area per year and was most common in forested areas. While inundation extent showed substantial interannual variability, the co-occurrence of disturbance and declines in inundation extent represented a minority of both change types, totaling 109 km² over the four-year period, and 186 km², using the National Wetland Inventory dataset in place of the Landsat-derived inundation extent. When the annual products were evaluated with permitted wetland and stream fill points, 95% of the fill points were detected, with most found by the disturbance product (89%) and fewer found by the inundation decline product (25%). The results suggest that mapping inundation alone is unlikely to be adequate to find and track anthropogenic wetland loss. Alternatively, remotely tracking both disturbance and inundation can potentially focus efforts to protect, manage, and restore wetlands.

Keywords: Chesapeake Bay; wetland fill; harmonic regression; Landsat; permit; surface water

1



Disturbance



2

Temporal Extent:
2015-2018

Spatial Extent:



Annual Inundation (2013-2018)

- Uses Landsat ETM+ (n=1036), OLI (n=1086) images across study area.
- Applied USGS Dynamic Surface Water Extent (DSWE) algorithm to ETM+
- Advantage: unsupervised algorithm
- Modified DSWE algorithm for OLI
 - Additional test for forested wetlands
 - Reduced commission error for suburban areas

Test	Landsat ETM+	Landsat OLI
Test 1	mNDWI > 123	mNDWI > 123
Test 2	MBSRV > 0	MBSRV > 0
Test 3	AWESH > 0	AWESH > 0
Test 4	mNDWI > -400, SWIR1 < 900, NIR < 1500, NDVI < 6000	mNDWI > -4400, SWIR1 < 900, NIR < 1500, NDVI < 6500
Test 5	mNDWI > -5000, SWIR1 < 3000, SWIR2 < 1000, NIR < 2500, NDVI < 4000, B < 1000	mNDWI > -5000, SWIR1 < 3000, SWIR2 < 1000, NIR < 2500, NDVI < 5500, B < 1000, BU3 < 1600
Test 6		G < 480, NIR < 2500, NDVI < 5500, BU3 < 1600



DSWE Classes

Not Water

Water - High Confidence

Water - Moderate Confidence

Partial Surface Water Pixel

Water or wetland, low confidence

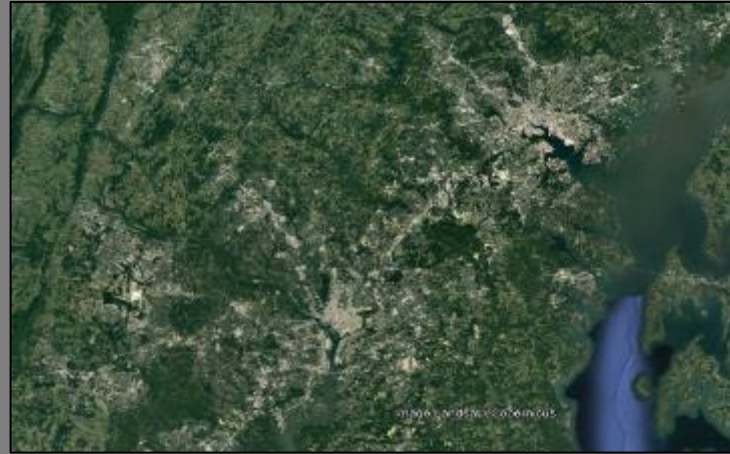
Regional surface water mapping challenges



Lots of forest (60%) – limited surface visibility



Appalachian Mts create severe topographical shadowing



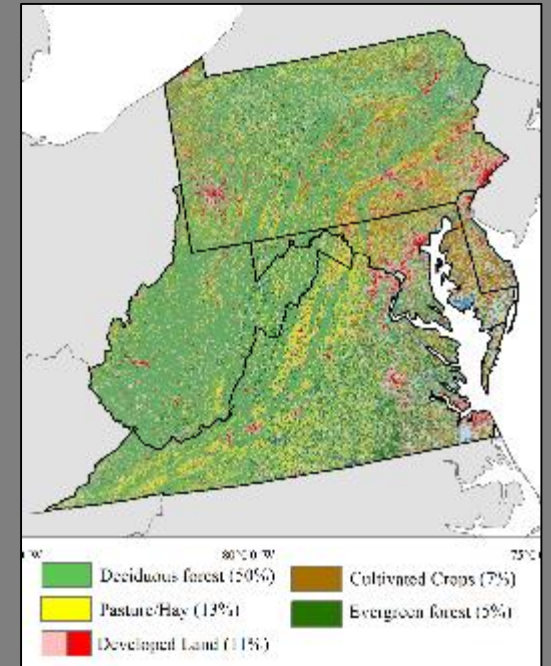
Multiple urban areas – D.C., Baltimore, Philadelphia, Pittsburgh, Virginia Beach, Richmond



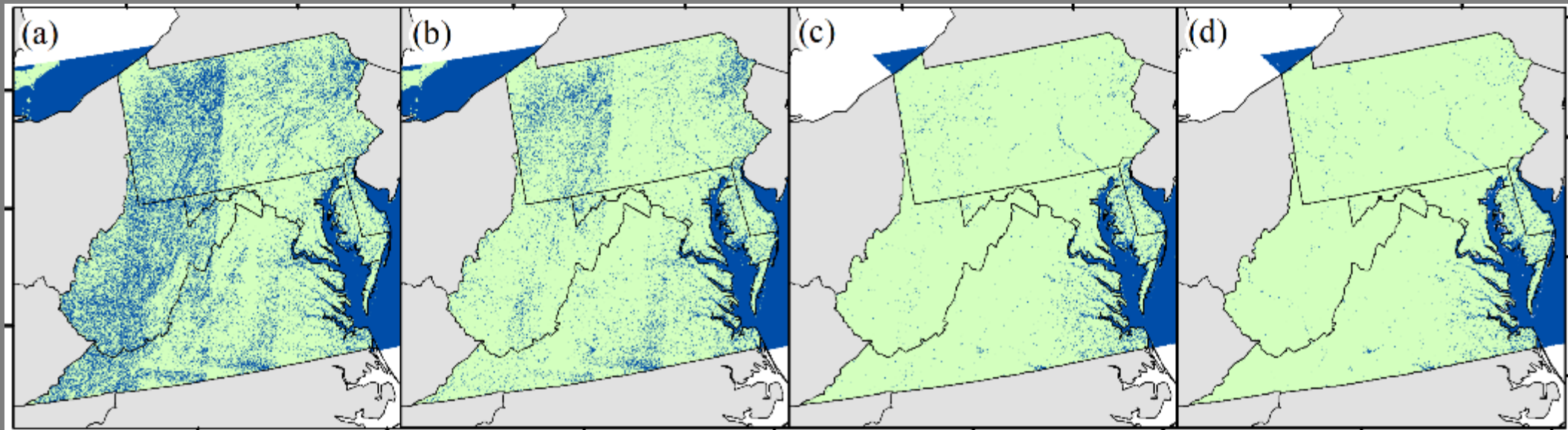
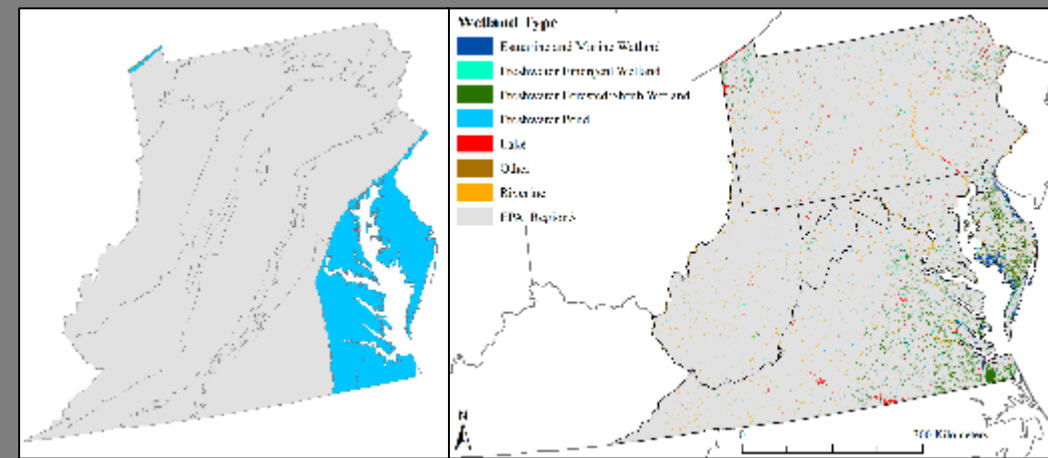
Delmarva Peninsula – high frequency of ephemeral wetlands



Lots of dynamic tidal wetlands



Response to regional challenges and big data challenges



(a) January 1 – May 31

- ≥ 2 observations of inundation
- All DSWE confidence classes

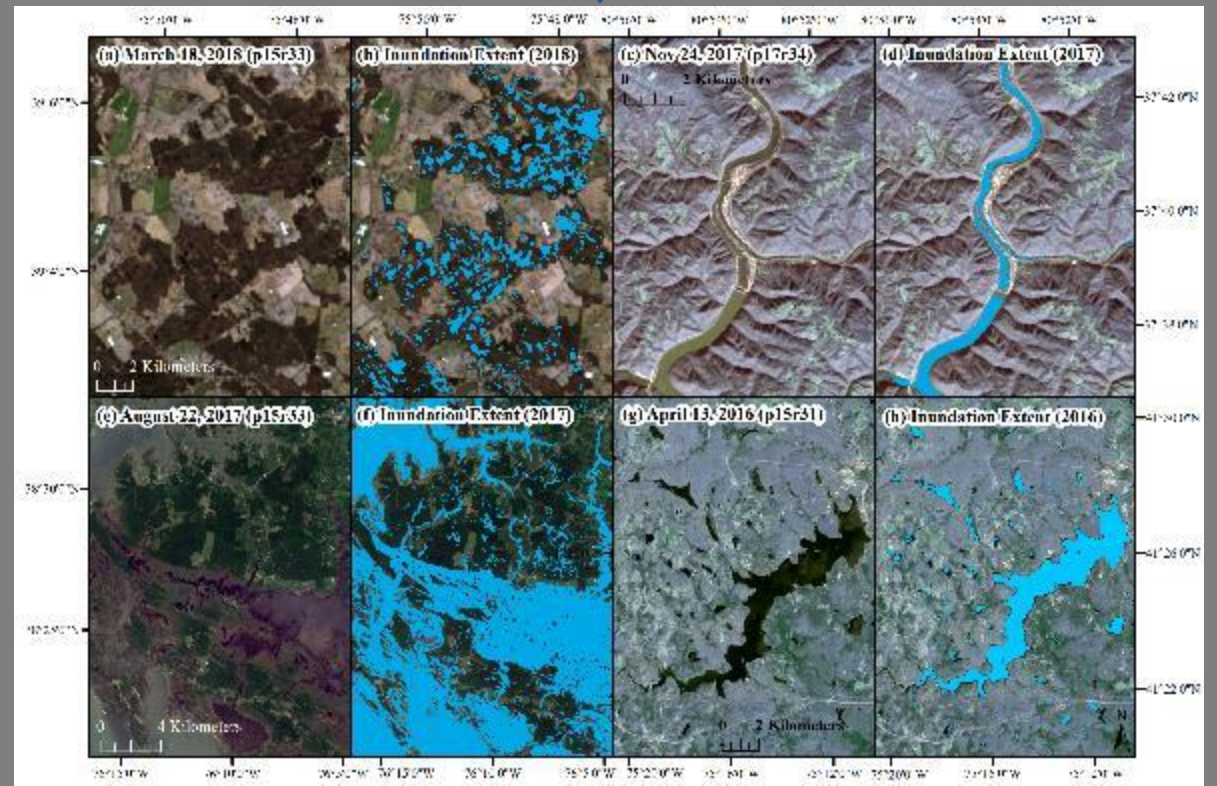
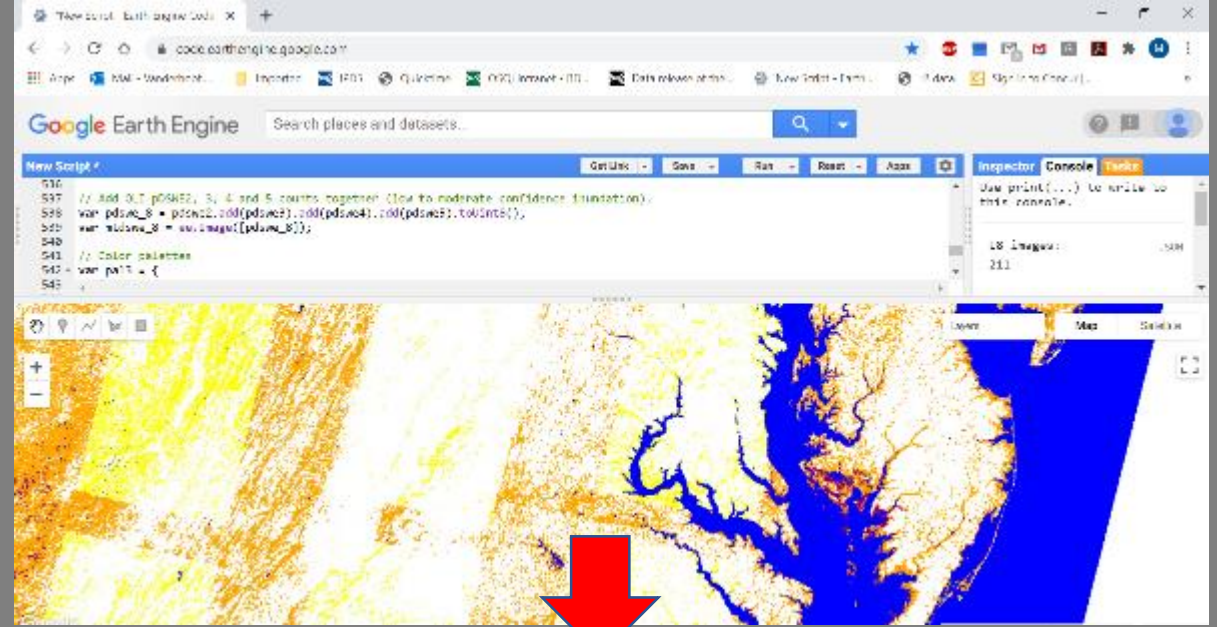
(b) Mask out slopes $> 7\%$.

(c) If high-confidence DSWE water class \rightarrow retain everywhere, otherwise, require more observations in uplands.

(d) Intersect a NWI polygon

Algorithm maps sub-pixel inundation

- Surface water depends on:
 1. DSWE water confidence class
 2. Number of inundation observations per year
 3. Ecoregion (lowland, upland)

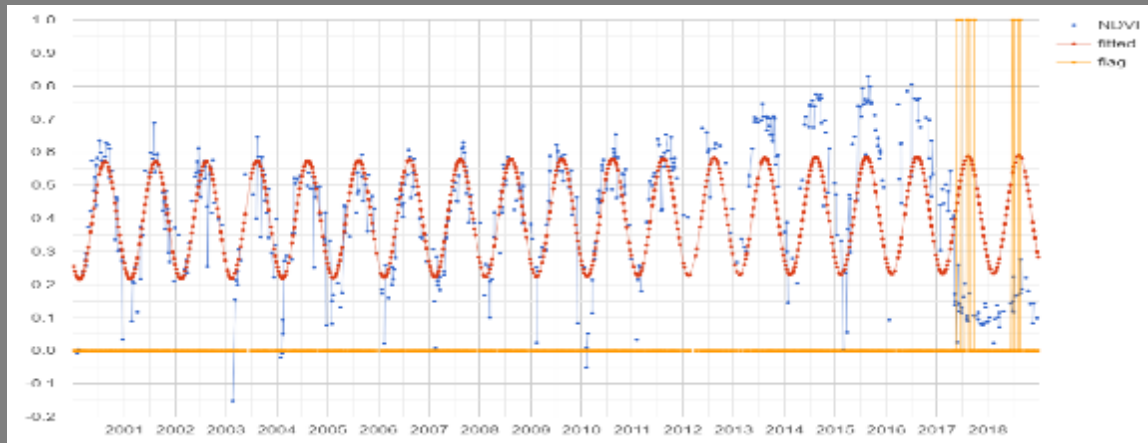


Mapping Disturbance

1a

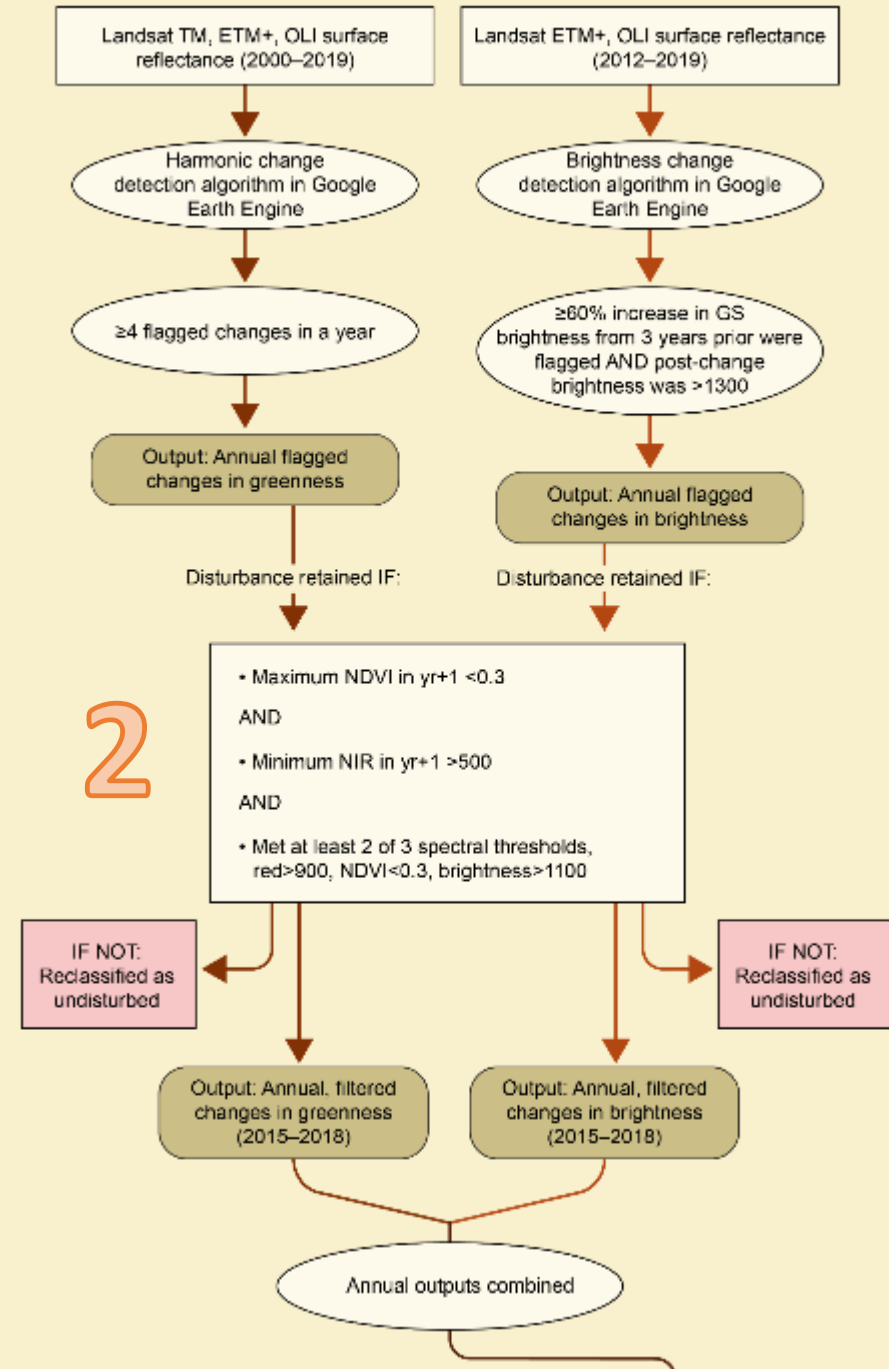
1a. Harmonic NDVI change analysis (17,956 images)

1b. Increase in brightness (7,213 images)



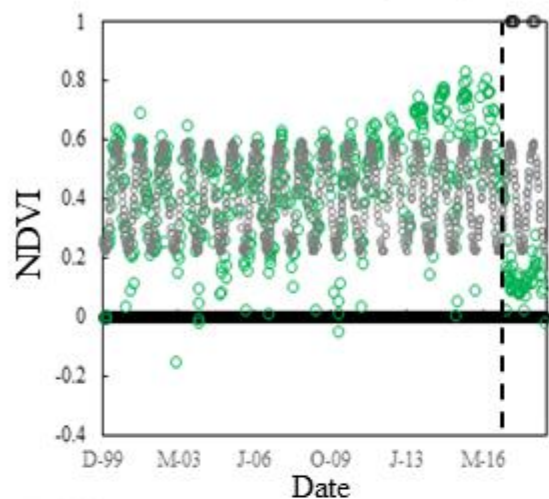
Disturbance

1b

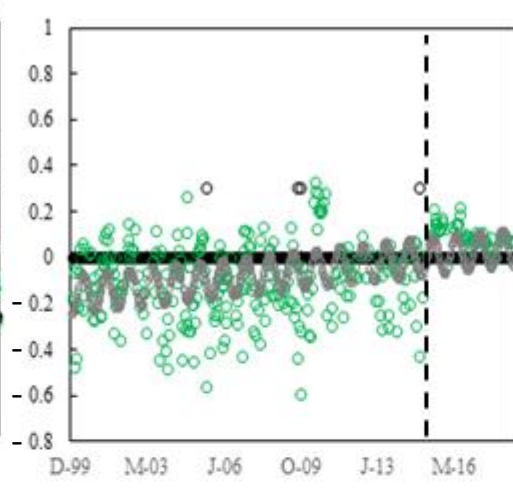


2

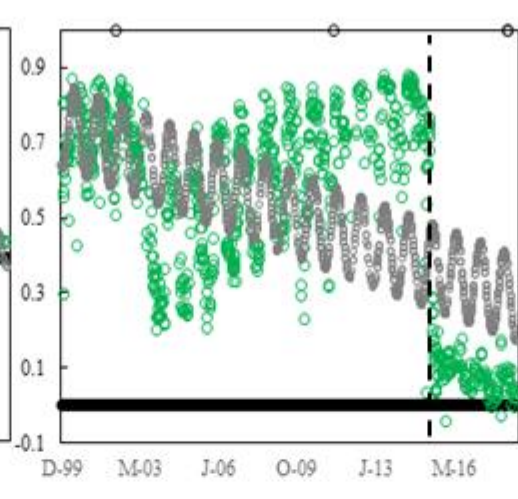
(a) Wetland to Soil (2017)



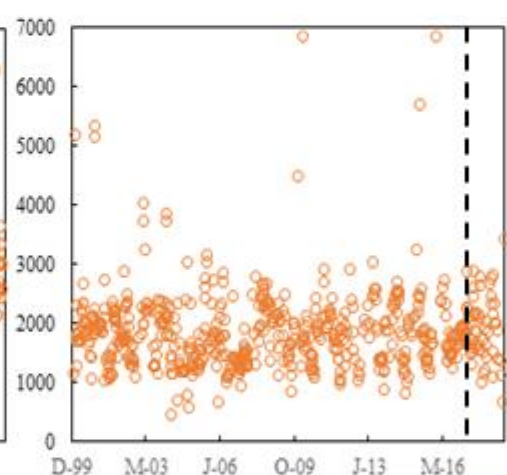
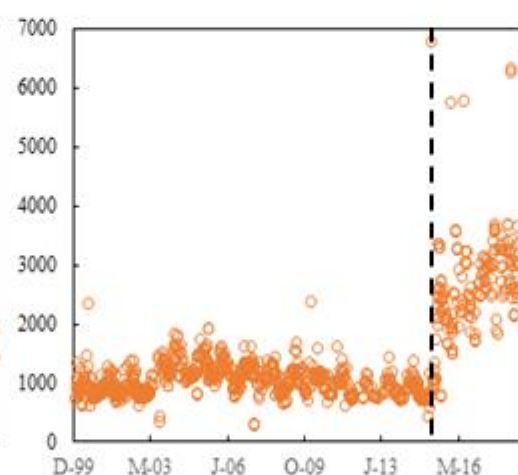
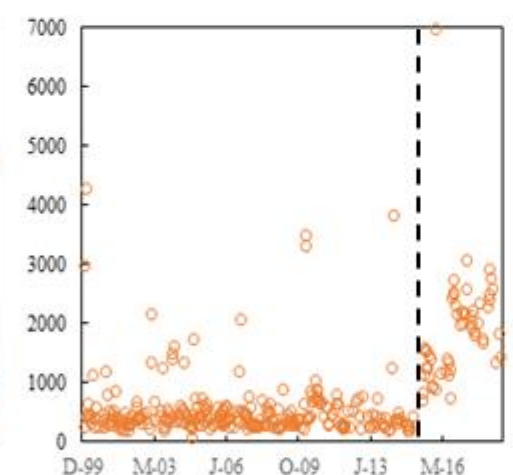
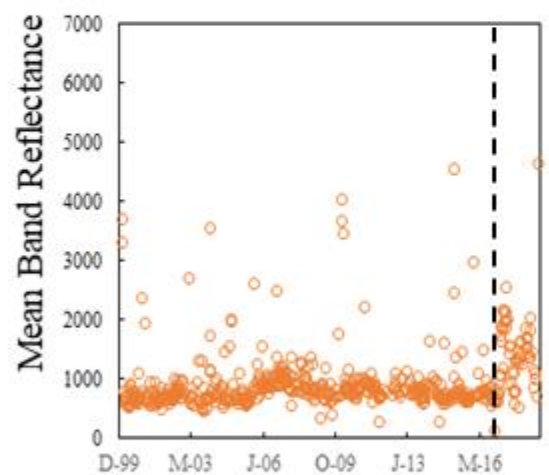
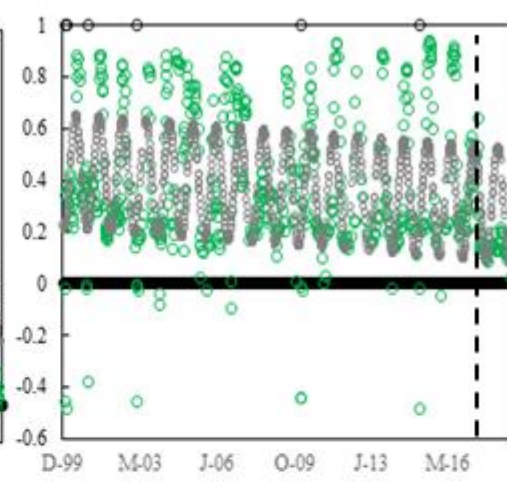
(b) Water to Soil (2015)



(c) Forest to Soil (2015)



(d) Grassland to Soil (2018)



| Disturbance Event

- NDVI
- Fitted NDVI
- Flag
- Brightness



38° 47' 45" N, 77° 32' 54" W



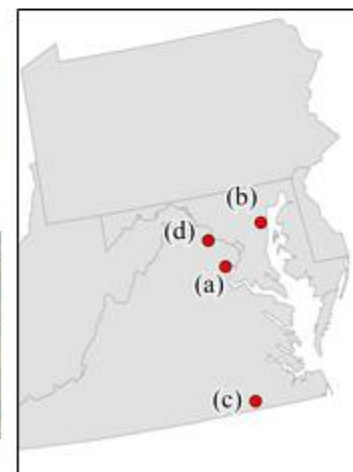
39° 14' 51" N, 76° 35' 9" W



36° 41' 17" N, 78° 22' 37" W

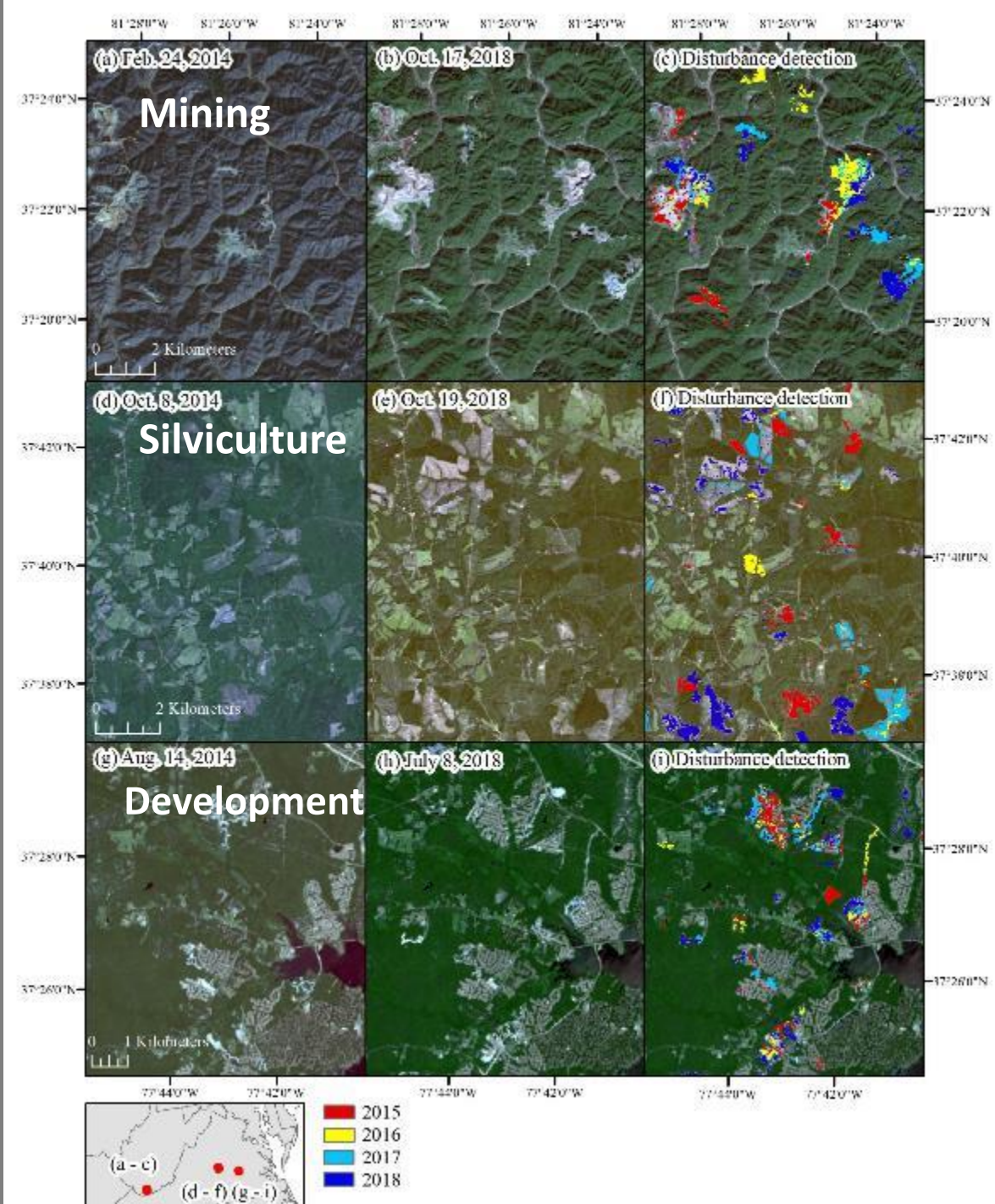
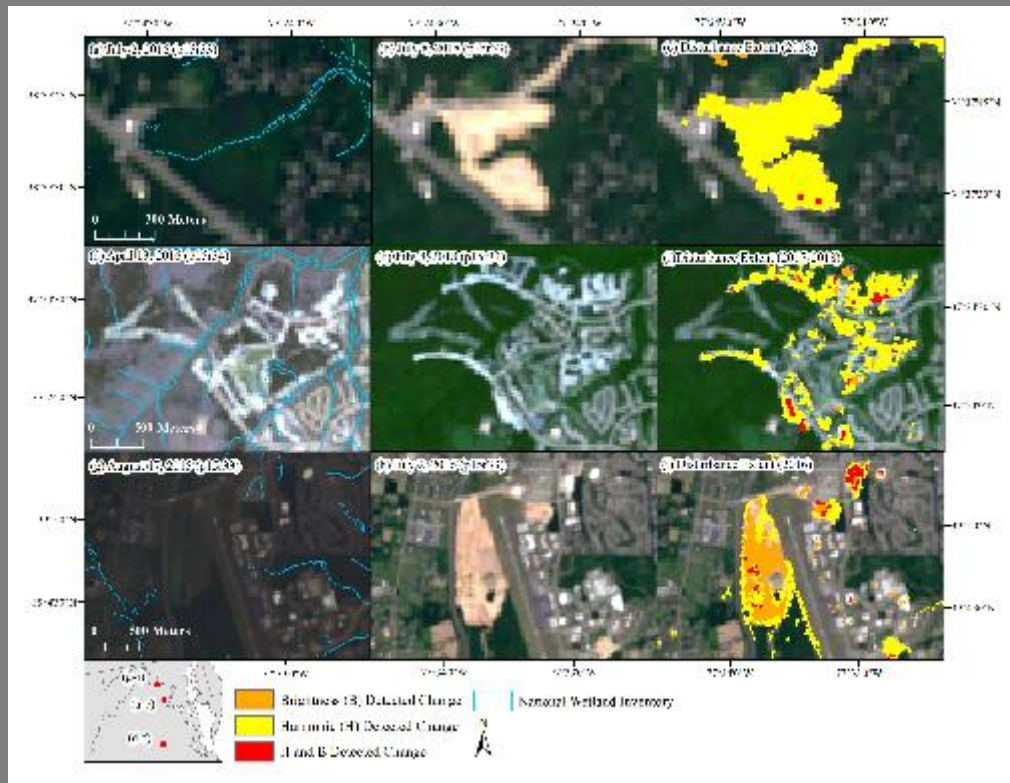


39° 4' 51" N, 77° 33' 50" W



Disturbance Output Examples

- 60% in NLCD forest (e.g., silviculture, development)
- 14% in NLCD developed classes – intensification of development
- 15% in NLCD agriculture (conversion from ag to development, or error)



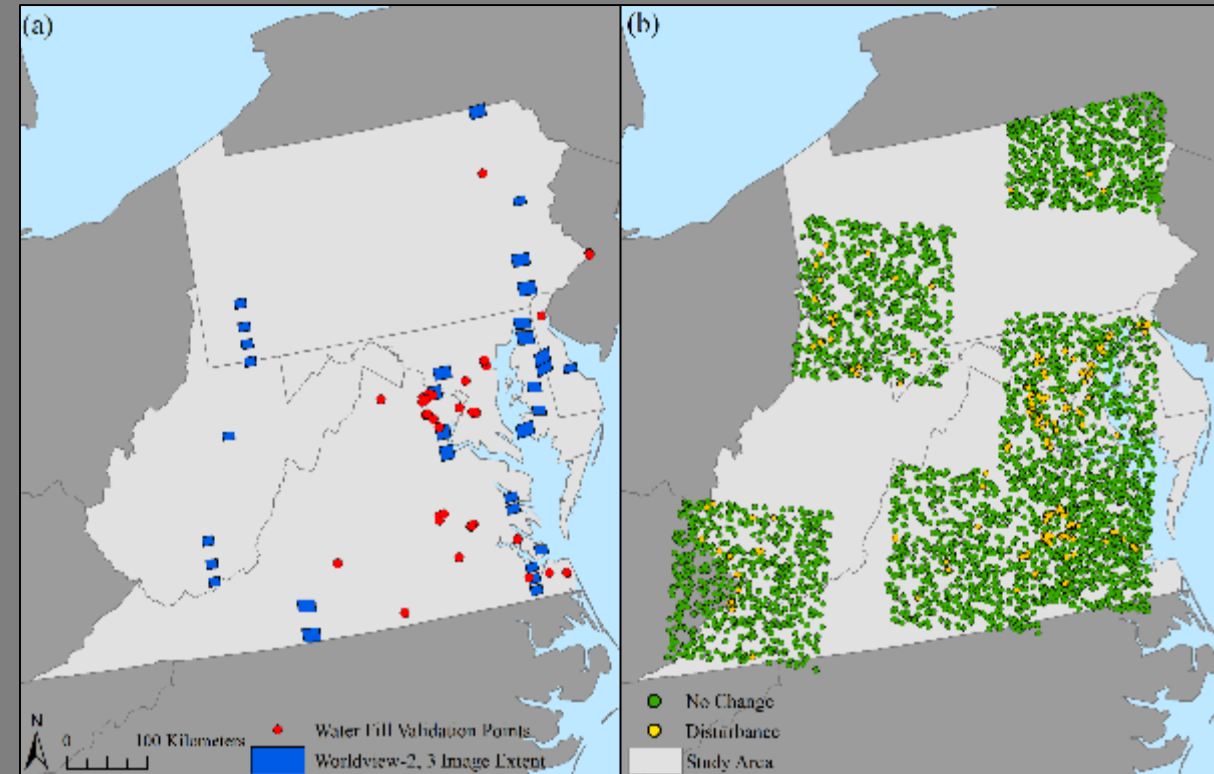
Product Validation

Inundation Extent:

- Landsat ETM+ inundation: 18% OE, 1% CE
- Landsat OLI inundation: 19% OE, 4% CE
- **ETM-OLI combined inundation: 13% OE, 4% CE**
- **MMU (1176 wetlands in WorldView imagery):**
 - 61% wetlands (0.4 – 1.0 ha)
 - 84% wetlands (1.0 – 1.5 ha)

Disturbance Extent:

- Disturbance (Harmonic): 27% OE, 2% CE
- Disturbance (Brightness): 56% OE, 1% CE
- **Disturbance (B-H combined): 15% OE, 2% CE**

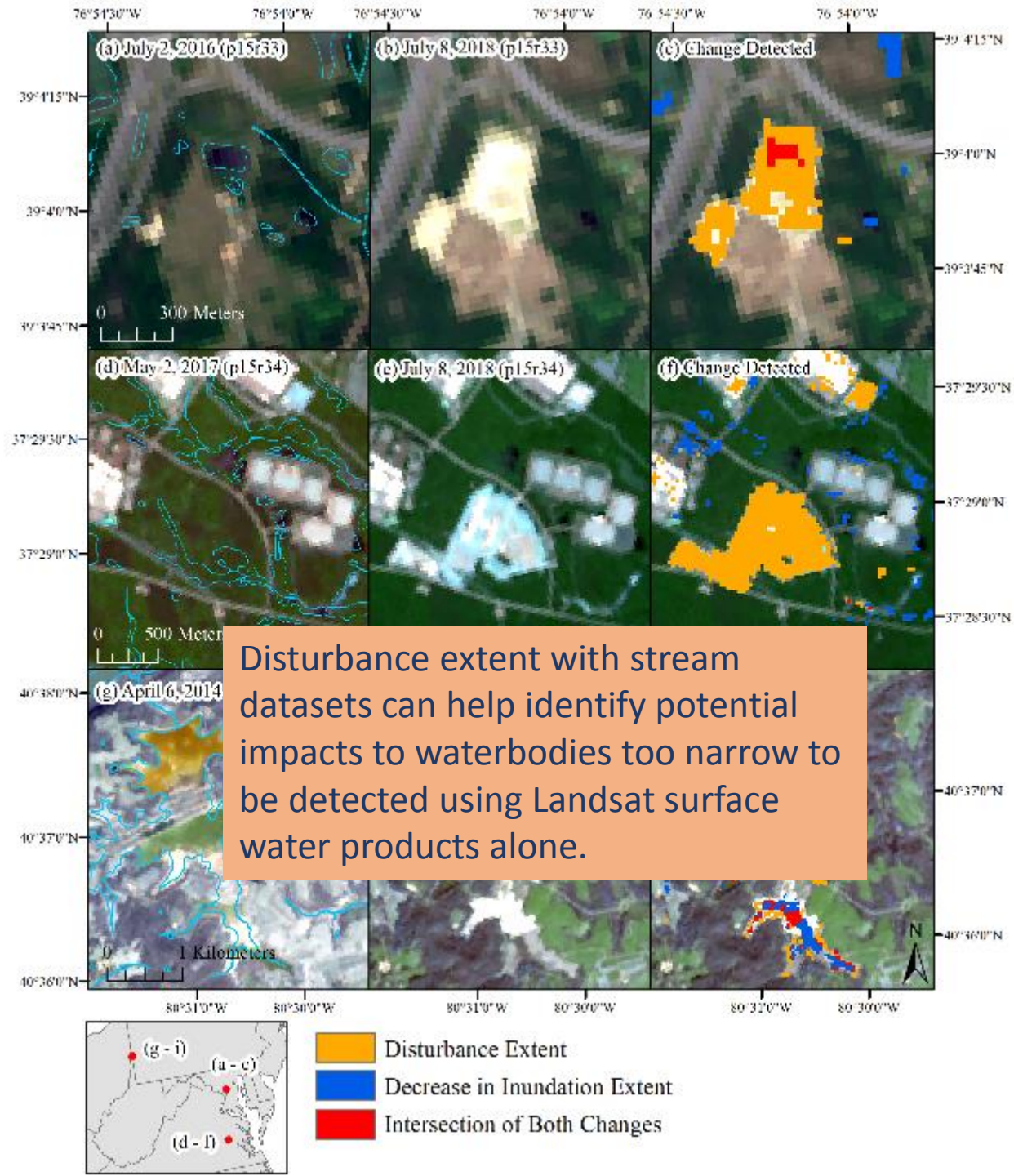


USACE Section 404 Permits (permitted aquatic resource loss (n=263))

- **Detected 95% of USACE water fill points** (71% disturbance only, 6% inundation loss only, 18%, disturbance and inundation loss)

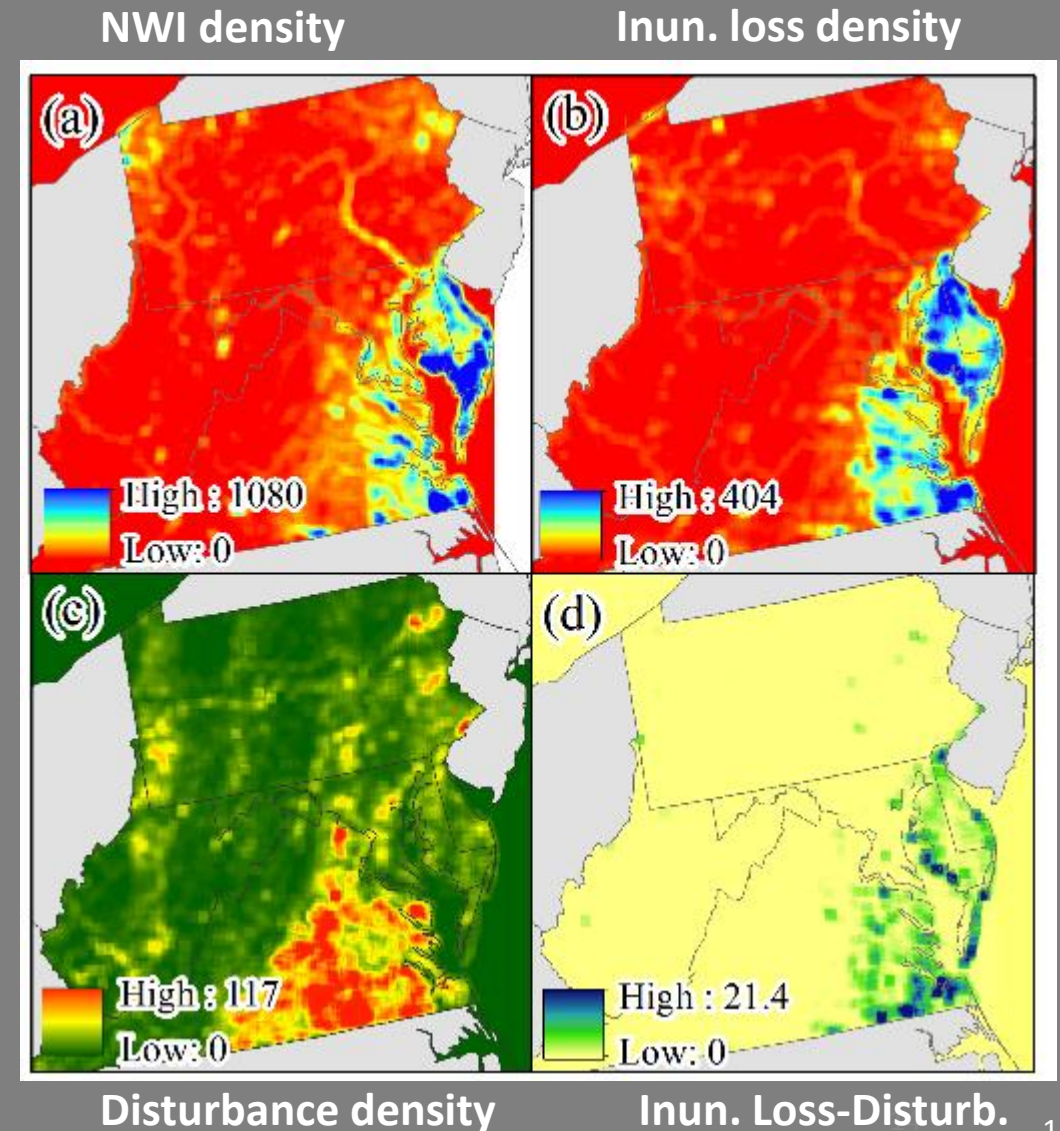
Products applied to examine aquatic resource loss

- Inundation loss (decline relative to previous 2 years) represented 7-11% of total inundation.
- Disturbance extent represented 0.25% (2016) to 0.35% (2015) of the study area.
- 99% of annual “inundation loss” occurred without a disturbance event (i.e., climate variability).



Patterns of disturbance and potential aquatic resource loss were uneven across the SA.

- A total of 108.6 km² (2015-2018) showed both disturbance and inundation loss.
- A total of 186 km² (2015-2018) intersected NWI polygons and disturbance.



So what can we do with this information?

- **Goal:** Enable stakeholders to make informed, strategic decisions in a cost-efficient manner.
- **Inundation:** where is the water? What water is relatively stable? What water is most dynamic and most susceptible to changes in climate (e.g., droughts, floods)
- **Disturbance:** where are changes in vegetation actively occurring? Where are changes minimal? Can this help us identify at risk regions or aquatic resource types?
- **Disturbance – NWI wetlands:** what aquatic resources are potentially at-risk? Where can we prioritize restoration needs?



Tracking disturbance and inundation to identify wetland loss

View ▾

Dates

Start Date : 2015-01-01

End Date : 2018-12-31

Publication Date : 2020-06-16

Citation

Vanderhoof, M.K., Christensen, J., Beal, Y.J.G. DeVries, B., Lang, M.W., Hwang, N., Mazzarella, C., and Jones, J.W., Tracking disturbance and inundation to identify wetland loss: U.S. Geological Survey data release, <https://doi.org/10.5066/P9ODILGN>.

Summary

Global trends in wetland degradation and loss have created an urgency to monitor wetland extent, as well as track the distribution and causes of wetland loss. Satellite imagery can be used to monitor wetlands over time, but few efforts have attempted to distinguish anthropogenic wetland loss from climate-driven variability in wetland extent. We present an approach to concurrently track land cover disturbance and inundation extent across the Mid-Atlantic region, United

Map »



Communities

Tracking disturbance and inundation to identify w...

View ▾

Distributor : [U.S. Geological Survey - ScienceBase](#)**SDC Data Owner :** [Geosciences and Environmental Change Science Center](#)**USGS Mission Area :** [Land Resources](#)**(2015-2018)**

Attached Files

Click on title to download individual files attached to this item or [download all](#) files listed below as a compressed file.

Tracking_disturbance_and_inundation_to_identify_wetland_loss_metadata.xml <i>Original FGDC Metadata</i>	 19.82 KB View
AppendixTables.zip	1.34 KB
decline_inundation_annual.zip	18.85 MB
disturbance_extent_annual.zip	10.5 MB
inundation_extent_annual.zip	20.8 MB
potential_wetland_loss.zip	17.61 MB

Related External Resources

Type: Related Primary Publication

Vanderhoof, M.K.; Christensen, J.; Beal, Y.-J.G.; DeVries, B.; Lang, M.W.; Hwang, N.; Mazzarella, C.; Jones, J.W. Isolating Anthropogenic Wetland Loss by Concurrently Tracking Inundation and Land Cover Disturbance across the Mid-Atlantic Region, U.S.. *Remote Sens.* 2020, 12, 1464

<https://www.mdpi.com/2072-4292/12/9/1464>

Tracking disturbance and inundation to identify wetland loss

Project overview

Repository

Files

Commits

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Contributors

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 LICENSE.md	Upload New File	2 months ago
 README.md	Update README.md	2 months ago
 Vanderhoof_GEE_disturbance_brightness.js	Upload New File	2 months ago
 Vanderhoof_GEE_disturbance_harmonic_regressi...	Upload New File	2 months ago
 Vanderhoof_GEE_inundation.js	Upload New File	2 months ago
 code.json	missing comma after disclaimerURL	2 months ago

Maintenance scheduled for Thursday, September 24th at 15:00 MDT. Expected downtime <1 hour.



T Tracking disturbance and inundation to identify wetland loss

GECS > Tracking disturbance and inundation to identify wetland loss > Repository


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/ Vanderhoof_GEE_disturbance_harmonic_r...

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Vanderhoof, Melanie Kay authored 3 months ago

 Vanderhoof_GEE_disturbance_harmonic_regression.js 13.4 KB  Edit Web IDE   

```

1 // Title: Producing annual disturbance extent using a harmonic Normalized Difference Vegetation Index (NDVI) Linear regression approach
2 // Authors: Melanie Vanderhoof (mvanderhoof@usgs.gov), Yen-Ju G. Beal
3 // Date: June 12, 2020
4
5 // Javascript code to be run in Google Earth Engine (GEE, code.earthengine.google.com).
6 // This code requires no input imagery from the user, all images and image collections used are provided by the Google Earth Engine
7 // To run the code for a unique study area extent and date range modify the specific variable section, export extent (i.e., studyArea
8 // Output is the number of times a pixel was mapped as disturbance in each year.
9 // Export output in batches using single Landsat rows ("WRS_ROW").
10
11
12 // Set a point of interest.
13 var poi = ee.Geometry.Point([-77.45, 27.2182]);

```

- Issues 0
- Merge Requests 0
- << Collapse sidebar

```
1 |
```

Use print(...) to write to this console.

Attention Python and JavaScript client library users!
Earth Engine servers now require client library v0.1.232, released August 20. Please update to the latest Python or JavaScript version to avoid a break in service.




```
12 // Export Extent
13 var roi = ee.Geometry.Polygon([
14   [-83.778, 36.540],
15   [-73.978, 36.540],
16   [-73.978, 42.322],
17   [-83.778, 42.322]
18 ]);
19 Map.addLayer(roi, {}, 'ROI');
20
21 Map.setCenter(-77.509, 38.087, 8);
22
23 // Specify variables for each analysis
24 var start = '2016-01-01'; // Start of input Landsat date range.
25 var end = '2016-12-31'; // End of input Landsat date range.
26 var doy_bounds = ee.List([1, 151]); // Use this to define day of year bounds.
27 var path_min = 14; //Landsat WRS PATH
28 var path_max = 19; //Landsat WRS PATH
29 var row_min = 31; //Landsat WRS ROW
30 var row_max = 35; //Landsat WRS ROW
31
32
33 //Load Landsat Operational Land Imager (OLI) image collection.
34 var oli_sr = ee.ImageCollection('LANDSAT/LC08/C01/T1_SR')
35   .filterDate(start, end)
36   .filter(ee.Filter.gte('WRS_PATH', path_min)) // Select path/row range.
37   .filter(ee.Filter.lte('WRS_PATH', path_max))
38
```

Surface Inundation Code

Use print(...) to write to this console.

L8 images: JSON
211

L7 images: JSON
184

L7 image after calc indi... JSON
ImageCollection LANDSA... JSON

L7 image after test1: JSON
ImageCollection LANDSA... JSON

```
New Script *
11
12 // Set a point of interest.
13 var roi = ee.Geometry.Point([-77.45, 37.218]);
14
15 // Center map over the roi.
16 Map.setCenter(-77.45, 37.218, 15);
17
18 // Specify variables for each analysis
19 var start = '2000-01-01'; //start of Landsat image acquisition range
20 var end = '2019-12-31'; //end of Landsat image acquisition range
21 var path_min = 14; //Landsat WRS PATH
22 var path_max = 16; //Landsat WRS PATH
23 var row_min = 33; //Landsat WRS ROW
24 var row_max = 34; //Landsat WRS ROW
25 var export_start = 2015; //Start of annual products
26 var export_end = 2019; //End of annual products
27
28 // Export Extent
29 var studyArea = ee.Geometry.Polygon([
30   [-83.778, 36.540],
31   [-73.978, 36.540],
32   [-73.978, 42.322],
33   [-83.778, 42.322]
34 ]);
35 Map.addLayer(studyArea, {}, 'Study area');
36
37 // Load Landsat Operational Land Imager (OLI) surface reflectance image collection.
38 var oli = ee.ImageCollection('LANDSAT/LC08/C01/T1_SR')
39   .filterDate(start, end) // Filter image acquisition dates.
40
```

NDVI Harmonic Change Code

Inspector Console Tasks

Use print(...) to write to this console.

L8 images:	748	JSON
L5 images:	1110	JSON
L7 images:	2029	JSON
Count:	3887	JSON
1.0		JSON
ImageCollection (Computin...		
fitted		JSON
ImageCollection (Computin...		


```
New Script *
52 var cloudShadowBitMask = 1 << 3;
53 var cloudsBitMask = 1 << 5;
54 // Get the pixel QA band.
55 var qa = image.select('pixel_qa');
56 // Both flags should be set to zero, indicating clear conditions.
57 var mask = qa.bitwiseAnd(cloudShadowBitMask).eq(0)
58 | .and(qa.bitwiseAnd(cloudsBitMask).eq(0));
59 // Return the masked image.
60 return image.updateMask(mask);
61 });
62
63 print('L8 images:', oli.size());
64
65 // Load Landsat Thematic Mapper (TM) and Enhanced Thematic Mapper plus (ETM+) image collections.
66 var tm = ee.ImageCollection('LANDSAT/LT05/C01/T1_SR')
67 .filterMetadata('IMAGE_QUALITY', 'equals', 9)
68 .filterDate(start, end) // Filter image acquisition dates.
69 .filter(ee.Filter.gte('WRS_PATH', path_min)) // Define path/row range.
70 .filter(ee.Filter.lte('WRS_PATH', path_max))
71 .filter(ee.Filter.gte('WRS_ROW', row_min))
72 .filter(ee.Filter.lte('WRS_ROW', row_max));
73 var etm = ee.ImageCollection('LANDSAT/LE07/C01/T1_SR')
74 .filterMetadata('IMAGE_QUALITY', 'equals', 9)
75 .filterDate(start, end) // Filter image acquisition dates.
76 .filter(ee.Filter.gte('WRS_PATH', path_min)) // Define path/row range.
77 .filter(ee.Filter.lte('WRS_PATH', path_max))
78 .filter(ee.Filter.gte('WRS_ROW', row_min))
79 .filter(ee.Filter.lte('WRS_ROW', row_max));
80
```

NDVI Harmonic Change Code

Inspector Console Tasks

- annual_filter_2018 JSON
- Image (1 band) JSON
- annual_filter2_2018 JSON
- Image (1 band) JSON
- annual_filter3_2018 JSON
- Image (Computing)

Harmonic model: original and fitted values

NDVI

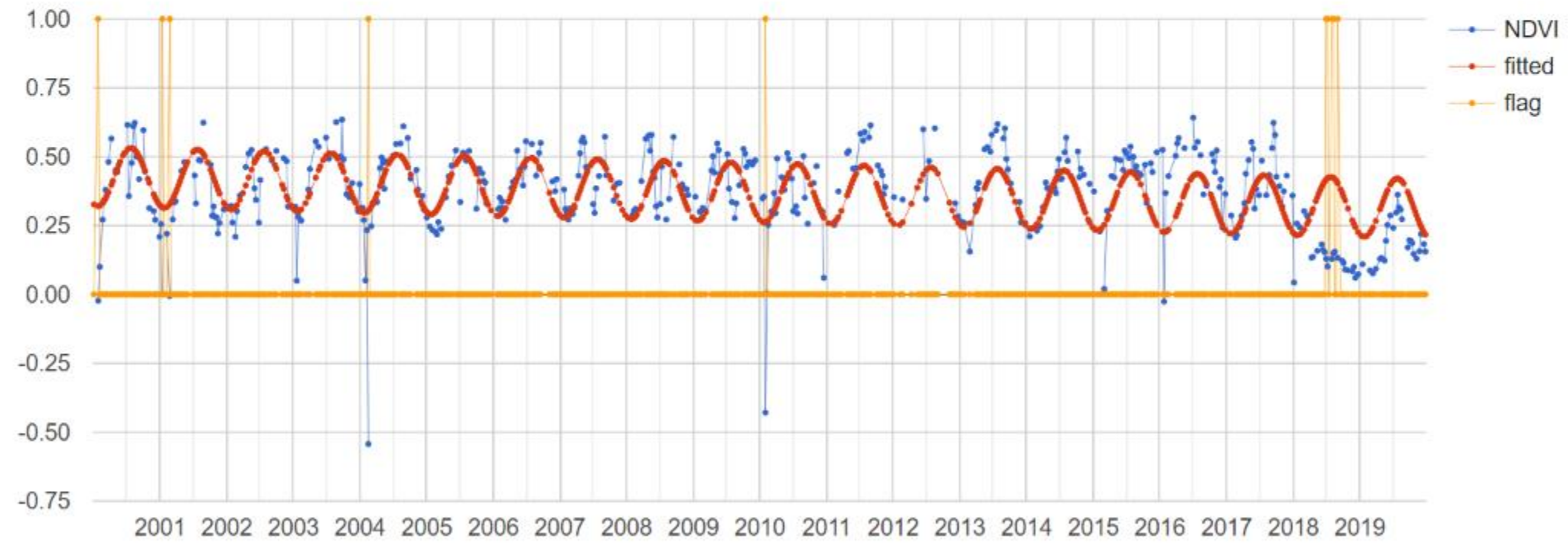
1/3

2010

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NDVI Harmonic Change Code

Harmonic model: original and fitted values



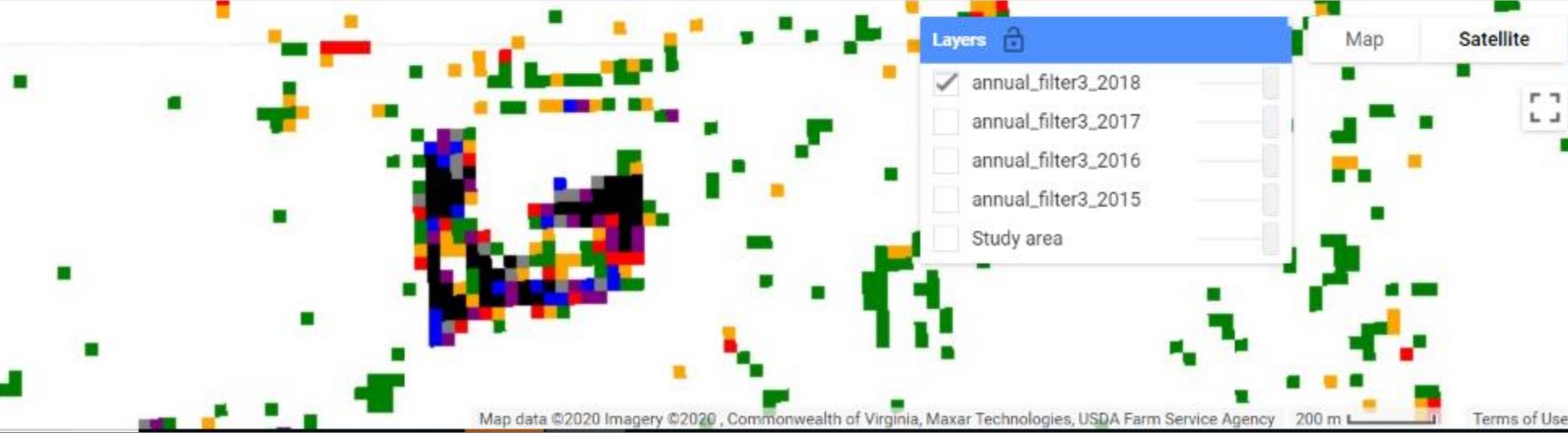
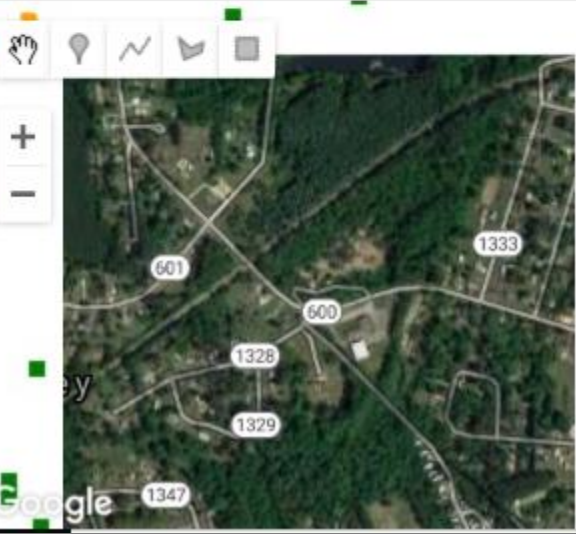
Google Earth Engine Search places and datasets...

```
New Script *
361 print('annual_filter3_' + y, annual_filter3);
362
363 // Visualization parameters
364 var vis_param = {
365   min: 0,
366   max: 7,
367   palette: ['white', 'green', 'orange', 'red', 'purple', 'blue'],
368 };
369 var vis_param2 = {
370   min: 0,
371   max: 3,
372   palette: ['white', 'purple', 'red', 'blue']
373 };
374
```



sole Tasks

	RUN
	RUN
	RUN
	RUN
:"project..."	✓ 30s
:"project..."	✓ 26s



Layers

- annual_filter3_2018
- annual_filter3_2017
- annual_filter3_2016
- annual_filter3_2015
- Study area

Map Satellite

Scripts Docs Assets A_Published_brightness

NEW

Owner (2)

- users...
- A_...
- A_...
- A_...
- A_...
- A_...
- An...
- Ba...
- Ba...
- Bri...
- Bri...

```

7 // To run the code for a unique study area extent and date range modify the specific variable section and define a region of inter
8 // Output is an annual binary raster of disturbance extent, identified as a >60% increase in brightness relative to the previous t
9
10 // Specify variables for each analysis
11 var start = '2012-01-01'; //start of Landsat image acquisition range
12 var end = '2019-12-31'; //end of Landsat image acquisition range
13 var path_min = 14; //Landsat WRS PATH
14 var path_max = 16; //Landsat WRS PATH
15 var row_min = 33; //Landsat WRS ROW
16 var row_max = 34; //Landsat WRS ROW
17 var export_start = 2015; //Start of annual products
18 var export_end = 2019; //End of annual products
19
20 // Export Extent
21 var roi = ee.Geometry.Polygon([
22   [-83.778, 36.540],
23   [-73.978, 36.540],
24   [-73.978, 42.322],
25   [-83.778, 42.322]
26 ]);
27
28

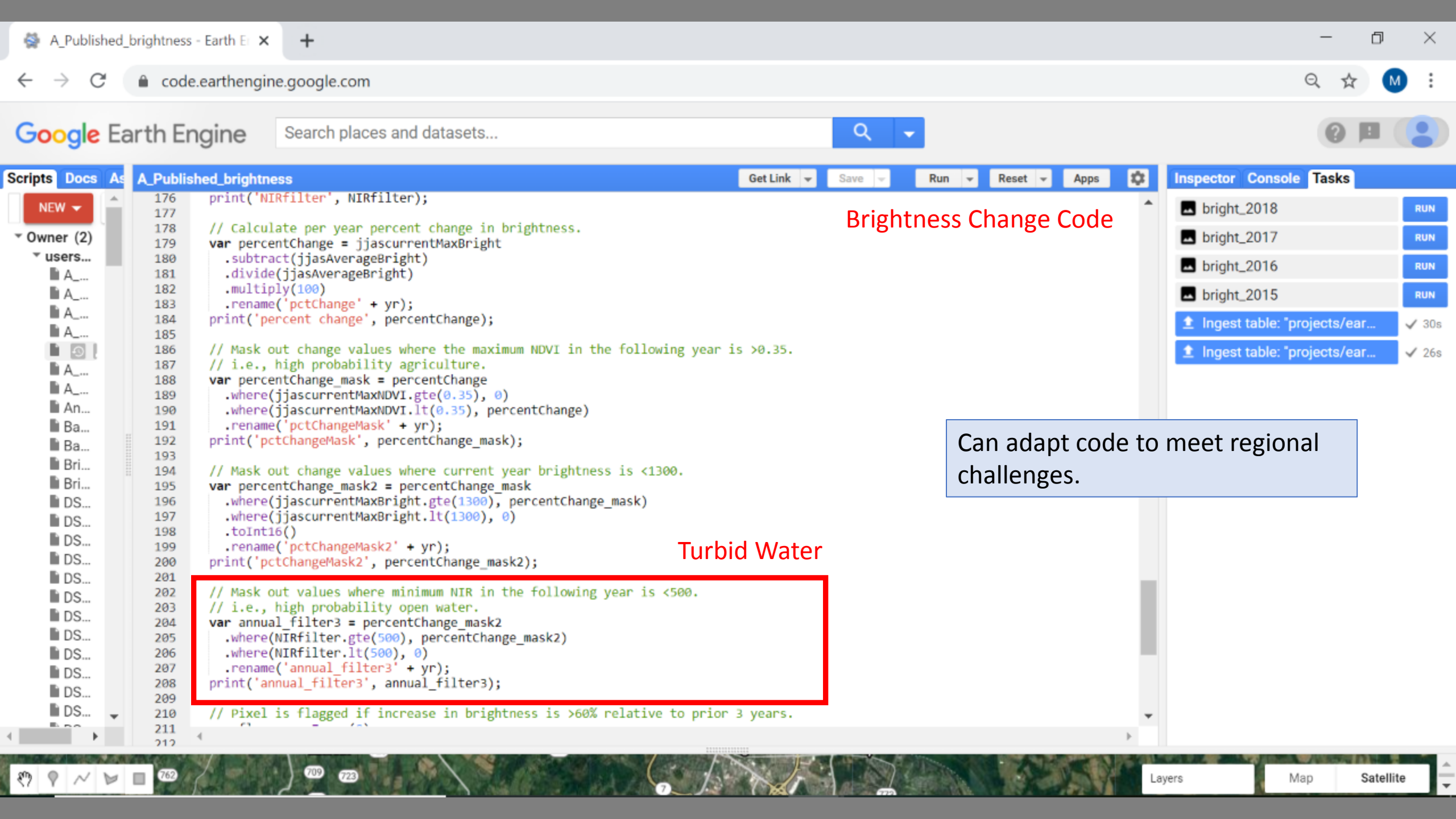
```

Brightness Change Code

bright_2018	RUN
bright_2017	RUN
bright_2016	RUN
bright_2015	RUN
Ingest table: "projects/ear..."	✓ 30s
Ingest table: "projects/ear..."	✓ 26s

Map navigation icons: hand, location pin, line graph, share, print

Map zoom controls: +, -



Brightness Change Code

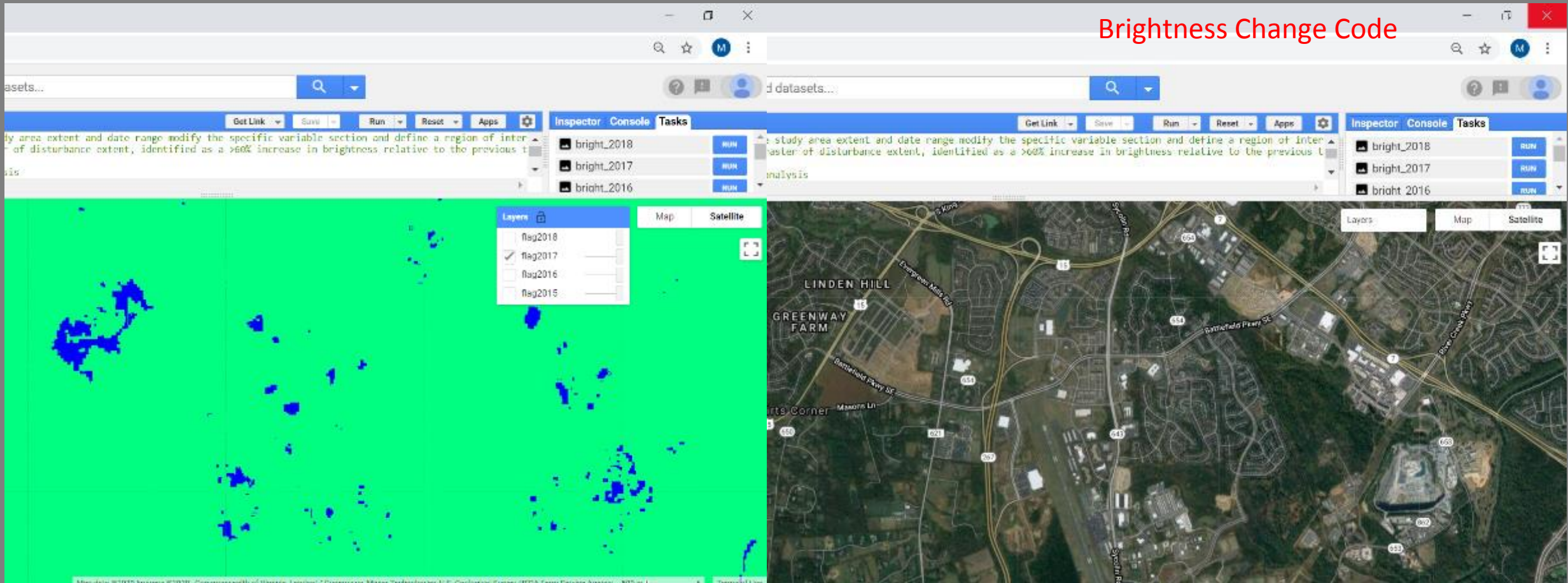
Can adapt code to meet regional challenges.

Turbid Water

```
176 print('NIRfilter', NIRfilter);
177
178 // Calculate per year percent change in brightness.
179 var percentChange = jjascurrentMaxBright
180   .subtract(jjasAverageBright)
181   .divide(jjasAverageBright)
182   .multiply(100)
183   .rename('pctChange' + yr);
184 print('percent change', percentChange);
185
186 // Mask out change values where the maximum NDVI in the following year is >0.35.
187 // i.e., high probability agriculture.
188 var percentChange_mask = percentChange
189   .where(jjascurrentMaxNDVI.gte(0.35), 0)
190   .where(jjascurrentMaxNDVI.lt(0.35), percentChange)
191   .rename('pctChangeMask' + yr);
192 print('pctChangeMask', percentChange_mask);
193
194 // Mask out change values where current year brightness is <1300.
195 var percentChange_mask2 = percentChange_mask
196   .where(jjascurrentMaxBright.gte(1300), percentChange_mask)
197   .where(jjascurrentMaxBright.lt(1300), 0)
198   .toInt16()
199   .rename('pctChangeMask2' + yr);
200 print('pctChangeMask2', percentChange_mask2);
201
202 // Mask out values where minimum NIR in the following year is <500.
203 // i.e., high probability open water.
204 var annual_filter3 = percentChange_mask2
205   .where(NIRfilter.gte(500), percentChange_mask2)
206   .where(NIRfilter.lt(500), 0)
207   .rename('annual_filter3' + yr);
208 print('annual_filter3', annual_filter3);
209
210 // Pixel is flagged if increase in brightness is >60% relative to prior 3 years.
211
```

Example from Leesburg, VA

Brightness Change Code



Project and Product Summary

1. Disturbance, inundation extent, and the co-location of the 2 have applications for monitoring and managing wetland extent and condition.
2. Published products and code can be used as a jumping off point and adapted to work across different regions.



Thank You! Questions?

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Products – ScienceBase:

<https://www.sciencebase.gov/catalog/item/5e430b15e4b0edb47be845ce>

Code – GitLab:

<https://code.usgs.gov/gecsc/tracking-disturbance-and-inundation-to-identify-wetland-loss/-/tree/master>

Research Presented Funded by:

EPA Region 3

EPA Region 3 RARE Program

USGS, Land Change Science Program

