



EASTERN INDIA ECOLOGICAL FORECASTING

A Multi-Sensor Approach to Enhance the
Prediction of Mangrove Biophysical
Characteristics in Bhitarkanika Wildlife
Sanctuary and Chilika Lagoon, Odisha, India

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Study Area

Bhitarkanika

Latitude: 20.71°N

Longitude: 86.86°E

Mangrove Types: Dense,
Closed & Open

Total Mangrove Species: 55

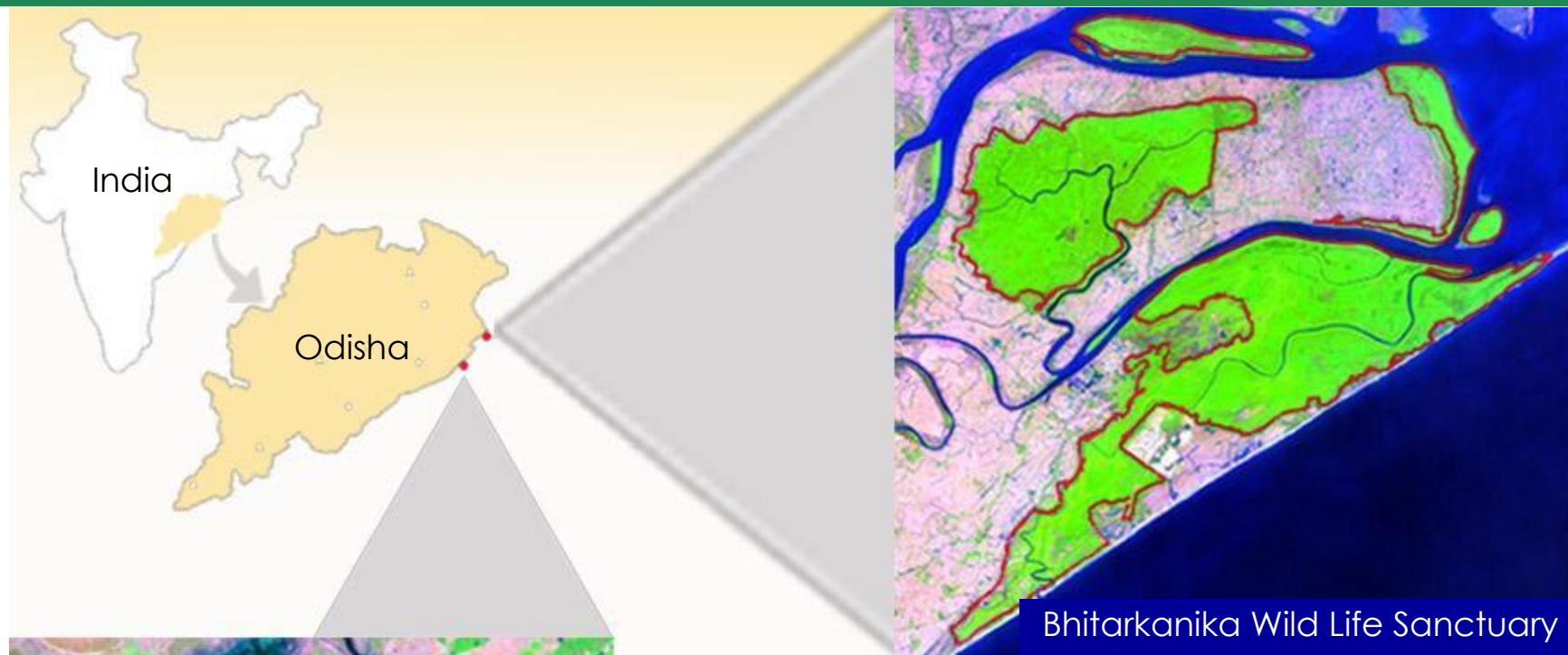
Mangrove Area: 145 km²

Chilika

Latitude: 19.84° N

Longitude: 85.47° E

Mangrove Types: Open,
Small patches



Bhitarkanika Wild Life Sanctuary



Chilika Mangroves



Red polygon outlines mangrove area



Community Concerns

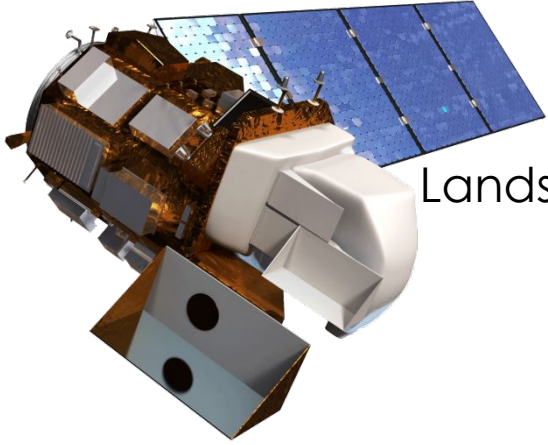
- 4 Residents from **36 villages** receive valuable resources and services from the mangroves.
- 4 Mangroves have been **overexploited** or **converted** to various other forms of land use.
- 4 **Encroachment** upon forests, **unauthorized aquaculture practices**, and **discharge of effluent** place even more pressure on mangrove forests and biodiversity.



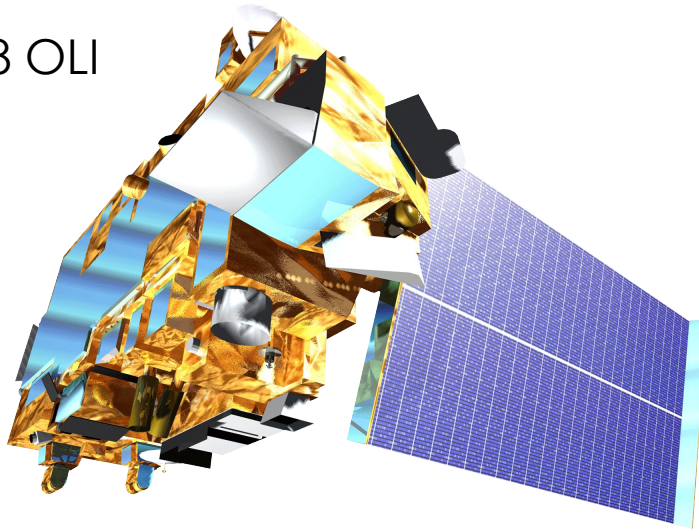
Source: Wildlife Institute of India (2003)



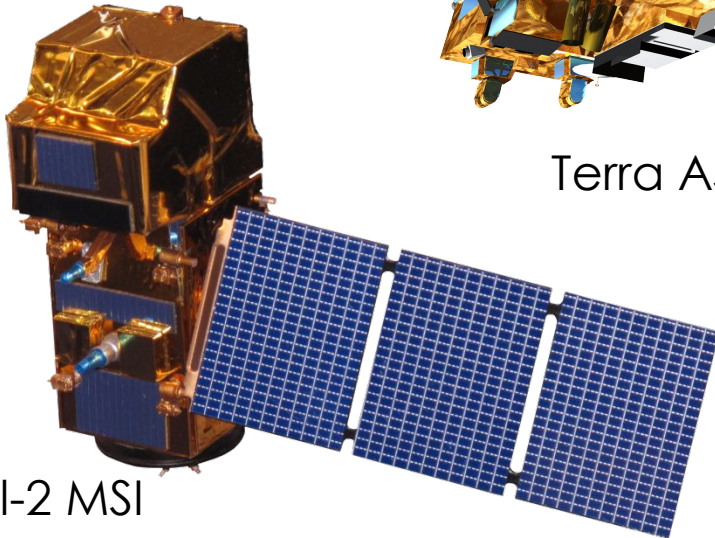
Objectives



Landsat-8 OLI



Terra ASTER and MODIS



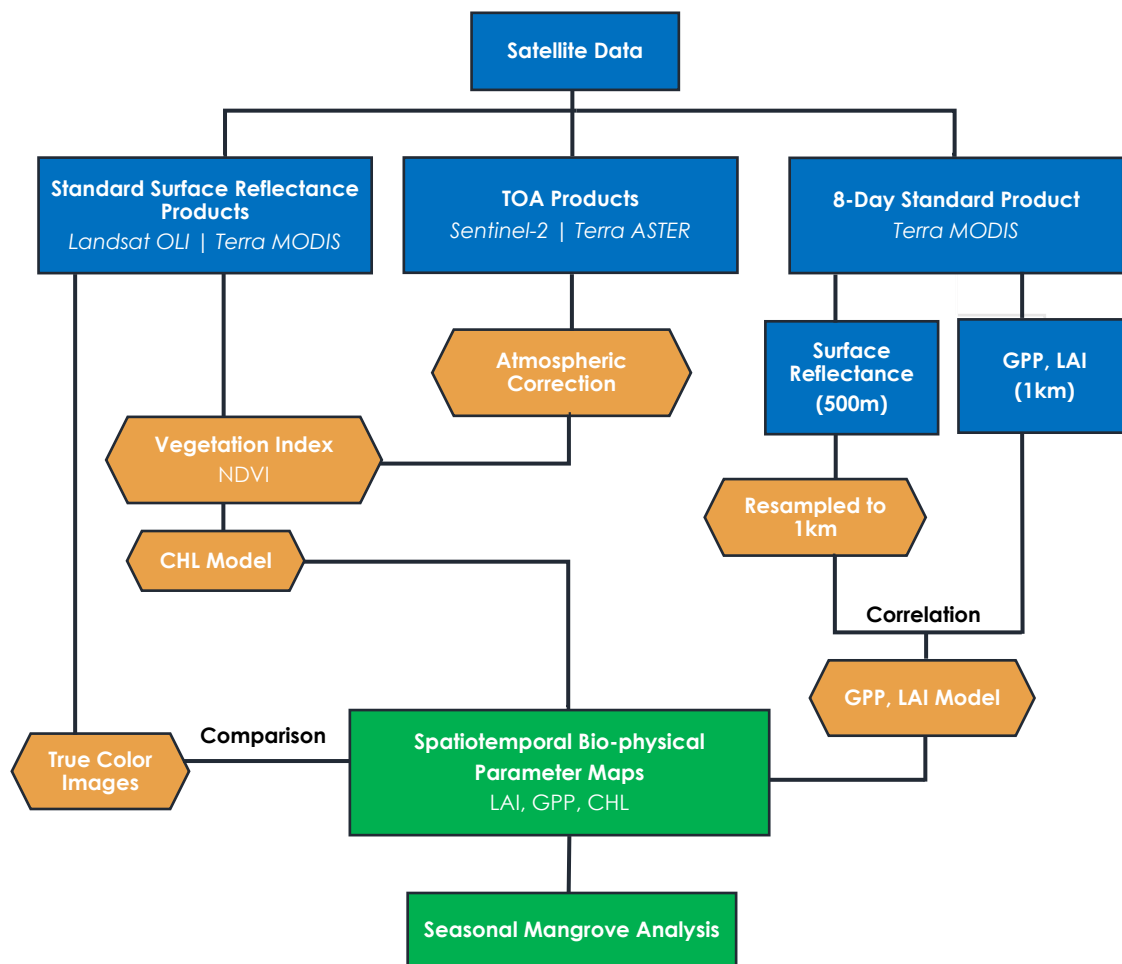
Sentinel-2 MSI

- 4 **Develop a multi-sensor mangrove biophysical characteristics prediction tool** for Bhitarkanika Wildlife Sanctuary and Chilika Lagoon using moderate resolution remote sensing reflectance data.
- 4 Derive a phenology in order to **enhance management and restoration efforts** by the Department of Forest and Environment in Odisha, India.

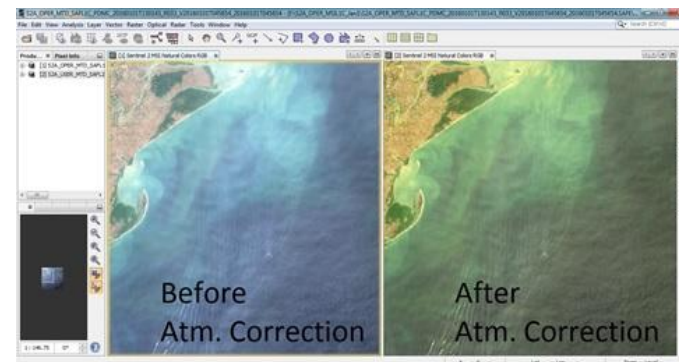


Methodology

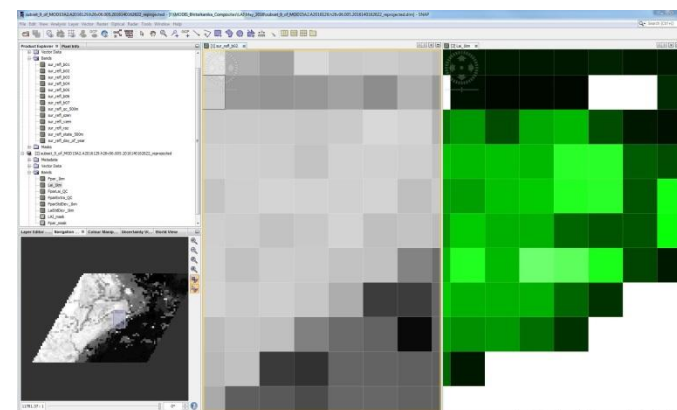
Workflow Diagram



Atmospheric Correction



Re-sampling Pixels at 1km

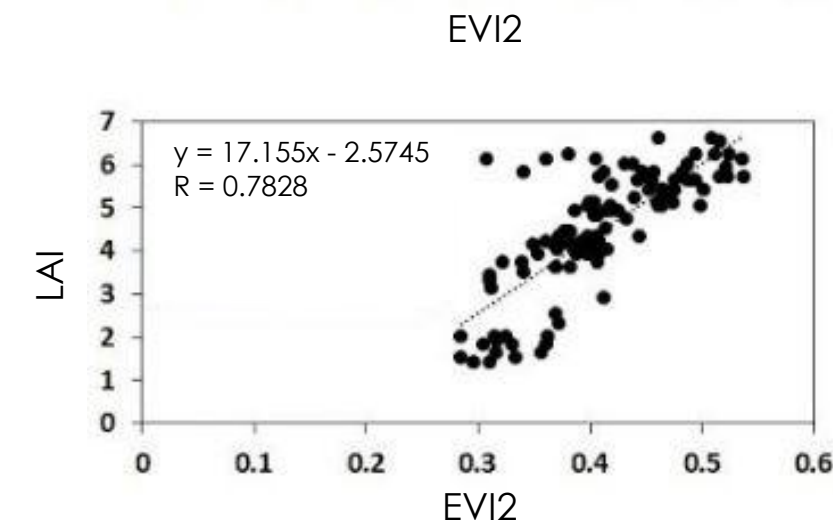
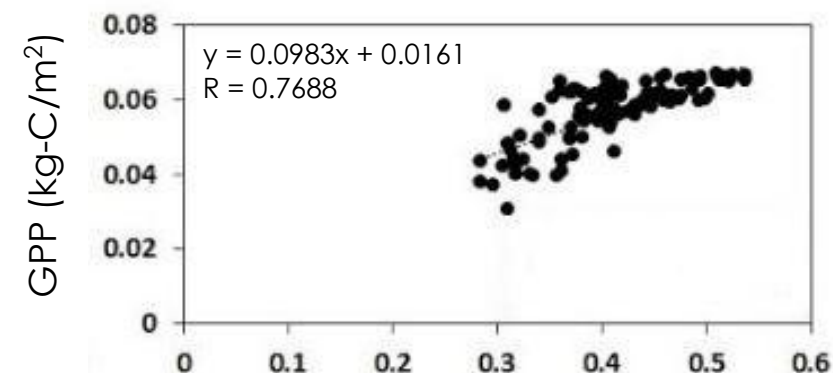




Results

Calibration Results

Bands & Indices	Abbreviation	Formula	LAI Correlation Coefficient (R)	LAI Correlation Equation	GPP Correlation Coefficient (R)	GPP Correlation Equation
Blue	B3	$R_{rs}(B3)$	0.64	$y = -.93.098x + 6.7841$	0.64	$y = -0.5418x + 0.0699$
Red	B1	$R_{rs}(B1)$	0.69	$y = -55.106x + 6.8859$	0.71	$y = -0.3287x + 0.0709$
Green	B4	$R_{rs}(B4)$	0.53	$y = -54.753x + 7.5682$	0.59	$y = -0.3543x + 0.0765$
Near-InfraRed	B2	$R_{rs}(B2)$	0.49	$y = 24.498x - 2.102$	0.45	$y = 0.1315x + 0.0212$
Shortwave Infrared-1	B5	$R_{rs}(B5)$	0.1	$y = -3.9268x + 5.5421$	0.095	$y = -0.0218x + 0.0624$
Shortwave Infrared-2	B6	$R_{rs}(B6)$	0.54	$y = -18.622x + 7.2501$	0.56	$y = -0.1126x + 0.0733$
Normalized Difference Vegetation Index	NDVI	$\frac{[R_{rs}(NIR) - R_{rs}(B1)]}{[R_{rs}(NIR) + R_{rs}(B1)]}$	0.69	$y = 9.5734x - 2.392$	0.73	$y = 0.0599x + 0.0135$
Enhanced Vegetation Index 1	EV11	$2.5 * \frac{[R_{rs}(NIR) - R_{rs}(B1)]}{(1 + R_{rs}(NIR) + 6 * R_{rs}(B1)) - 7.5 * R_{rs}(B3)}$	0.78	$y = 17.009x - 2.6598$	0.77	$y = 0.098x + 0.0153$
Enhanced Vegetation Index 2	EV12	$2.5 * \frac{[R_{rs}(NIR) - R_{rs}(B1)]}{(1 + R_{rs}(NIR) + 2.4 * R_{rs}(B1))}$	0.78	$y = 17.155x - 2.5745$	0.77	$y = 0.0983x + 0.0161$
Normalized Difference Vegetation Index (Green)	NDVI(G)	$\frac{[R_{rs}(NIR) - R_{rs}(B4)]}{[R_{rs}(NIR) + R_{rs}(B4)]}$	0.63	$y = 12.398x - 3.6427$	0.68	$y = 0.078x + 0.0054$
Simple Ratio	SR	$\frac{[R_{rs}(NIR)]}{[R_{rs}(B1)]}$	0.65	$y = 0.3428x + 2.0964$	0.67	$y = 0.0021x + 0.0421$
Normalized Difference Moisture Index	NDMI	$\frac{[R_{rs}(NIR) - R_{rs}(B6)]}{[R_{rs}(NIR) + R_{rs}(B6)]}$	0.65	$y = 7.4622x + 2.3086$	0.69	$y = 0.046x + 0.0431$

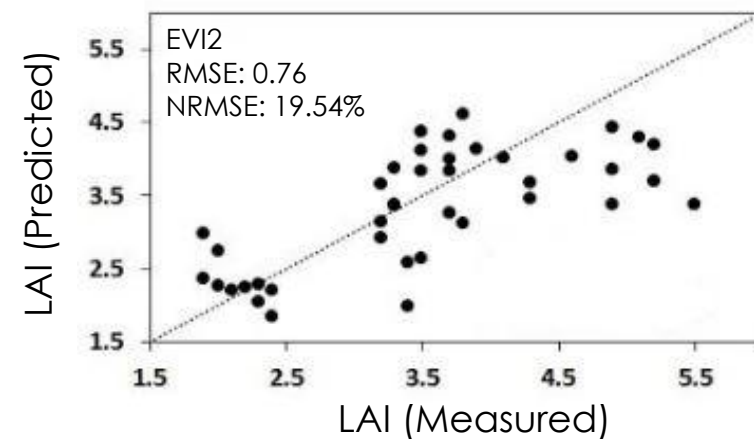
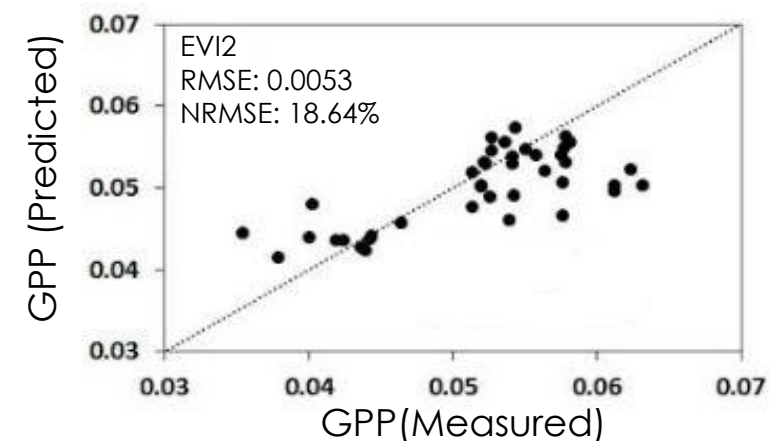




Results

Validation and Error Estimation

Bands & Indices	LAI: Root Mean Square Error (RMSE)	LAI: Percentage Normalized Root Mean Square Error (%NRMSE)	GPP: Root Mean Square Error (RMSE)	GPP: Percentage Normalized Root Mean Square Error (%NRMSE)
Blue	1.15	31.89	0.0066	23.63
Red	1.08	30.19	0.0063	22.76
Green	1.33	37.01	0.0076	27.47
Near-InfraRed	0.82	22.88	0.0059	21.26
Shortwave Infrared-1	1.47	40.91	0.0087	31.28
Shortwave Infrared-2	1.42	39.49	0.0082	29.51
Normalized Difference Vegetation Index	1.29	33.32	0.0073	25.64
Enhanced Vegetation Index 1	0.77	19.86	0.0055	19.26
Enhanced Vegetation Index 2	0.76	19.54	0.0053	18.64
Normalized Difference Vegetation Index (Green)	1.28	32.93	0.0072	25.41
Simple Ratio	1.46	37.46	0.011	37.44
Normalized Difference Moisture Index	1.18	30.32	0.0069	24.19

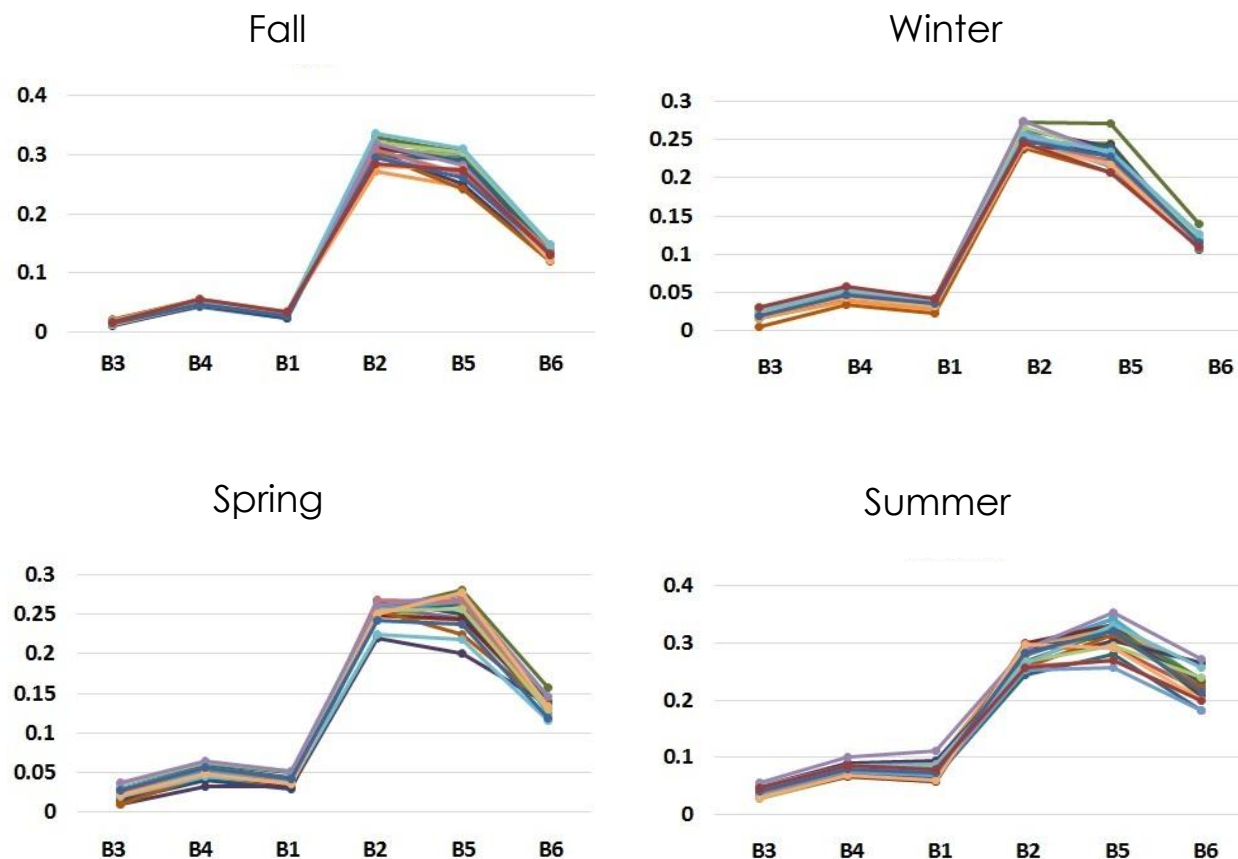




Results

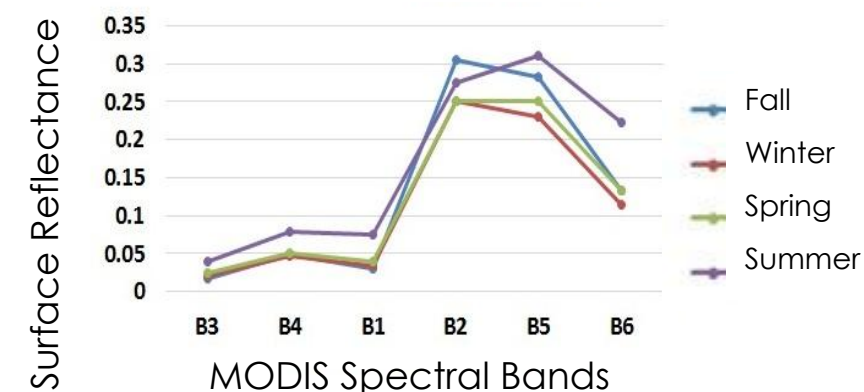
Seasonal Spectral Variability

Surface Reflectance



MODIS Spectral Bands

Mean Spectra

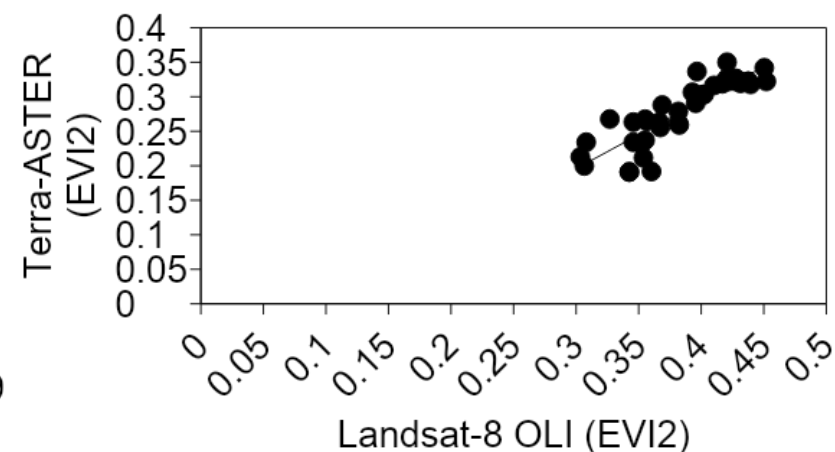
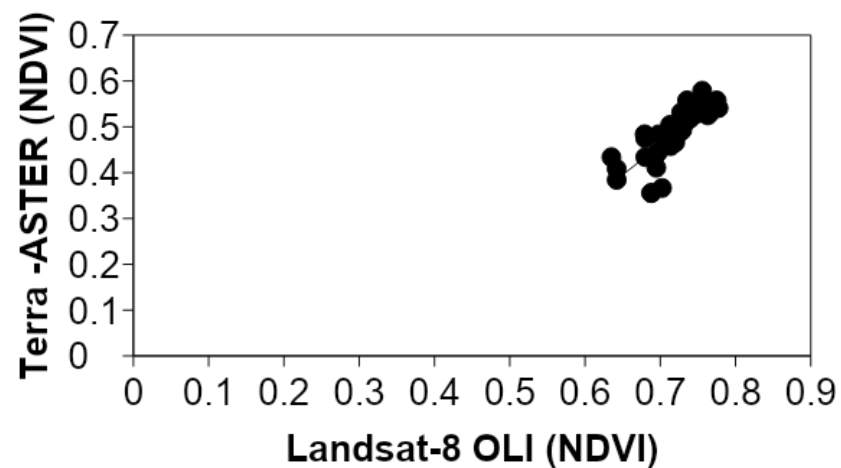
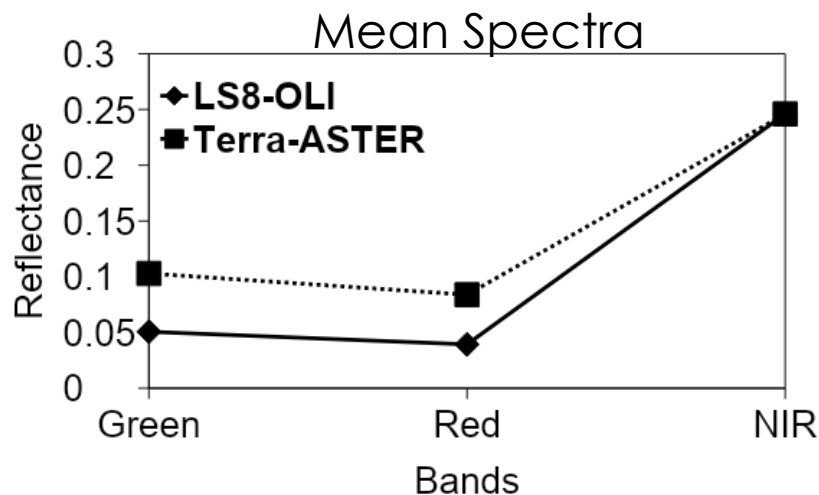


MODIS Bands	Center Wavelength and Bandwidth (nm)
Blue (B3)	469 (459 – 479)
Green (B4)	555 (545 – 565)
Red (B1)	645 (620 – 670)
Near-Infrared (B2)	859 (841 – 876)
Shortwave Infrared-1 (B5)	1240 (1230 – 1250)
Shortwave Infrared-2 (B6)	1635 (1628 – 1652)

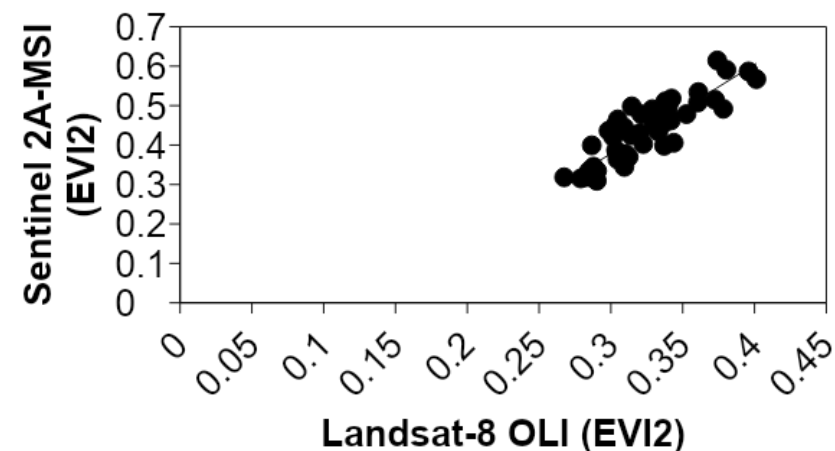
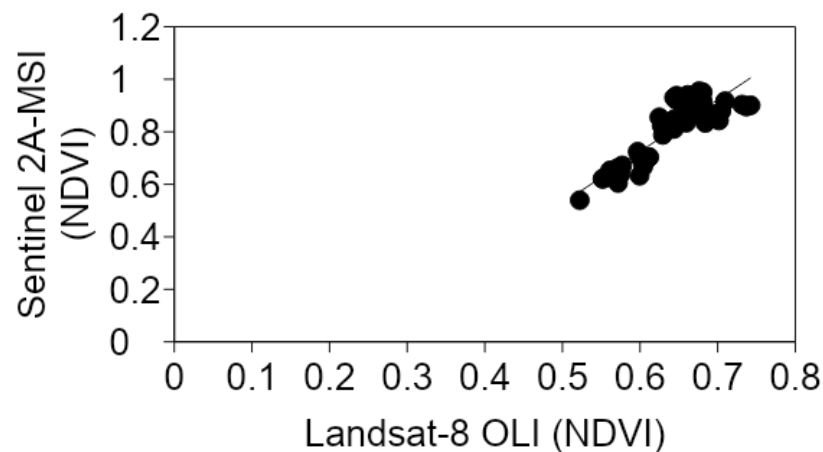
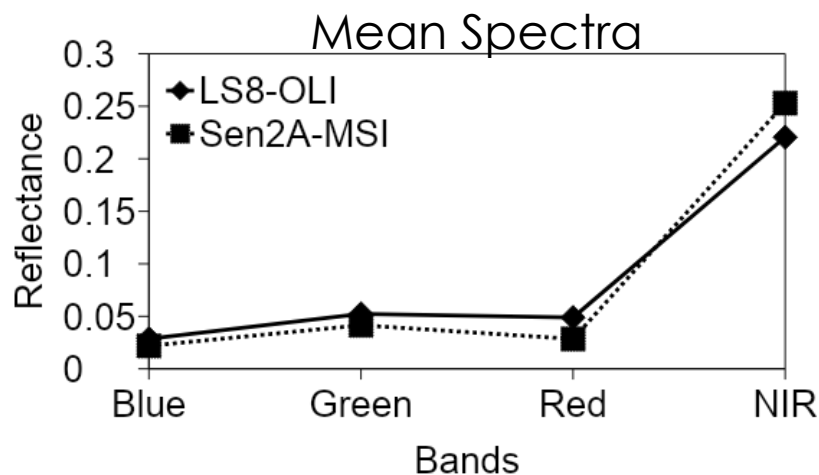


Results

ASTER Cross-Calibration



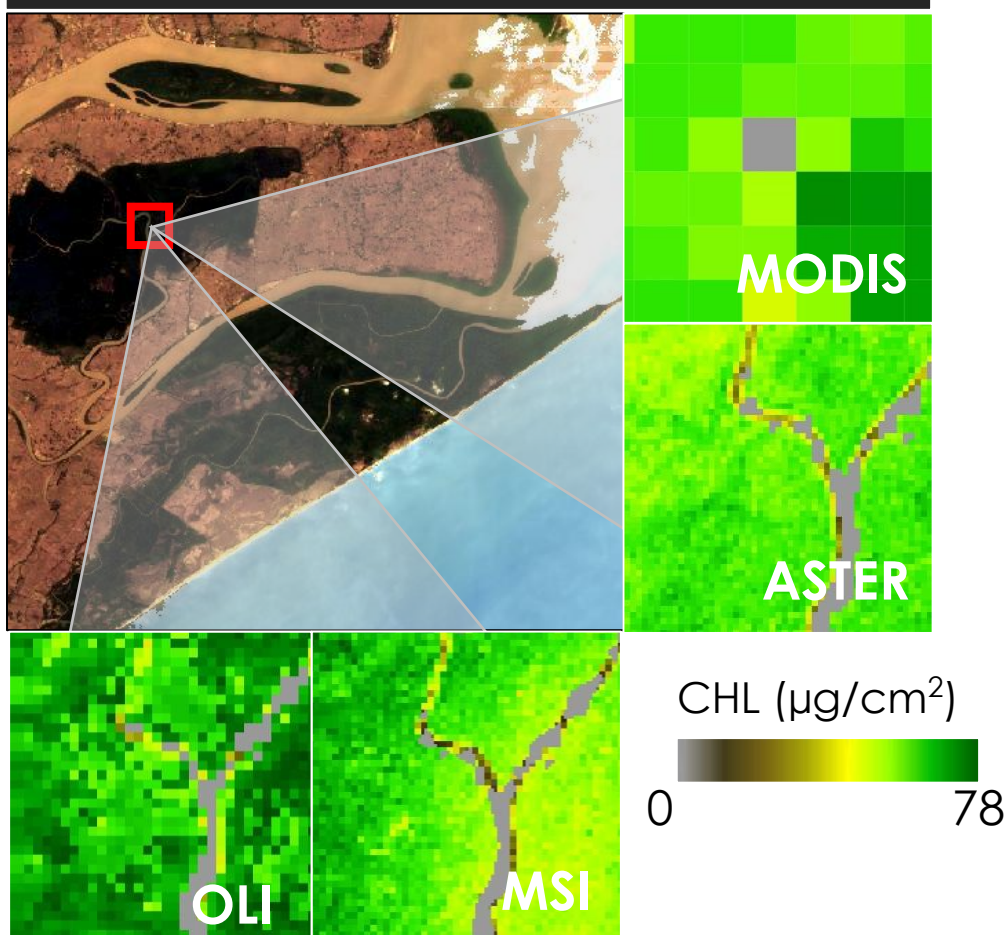
Sentinel-2 Cross-Calibration



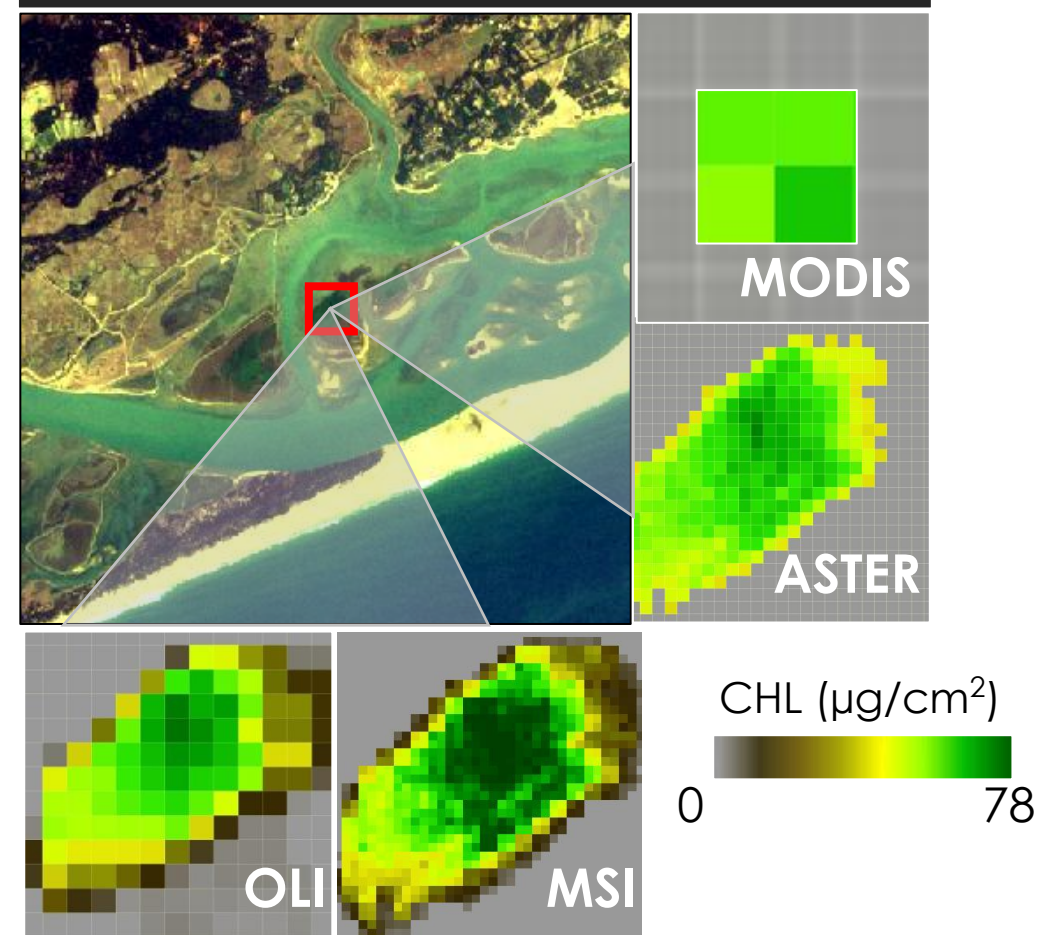


Results

Bhitarkanika



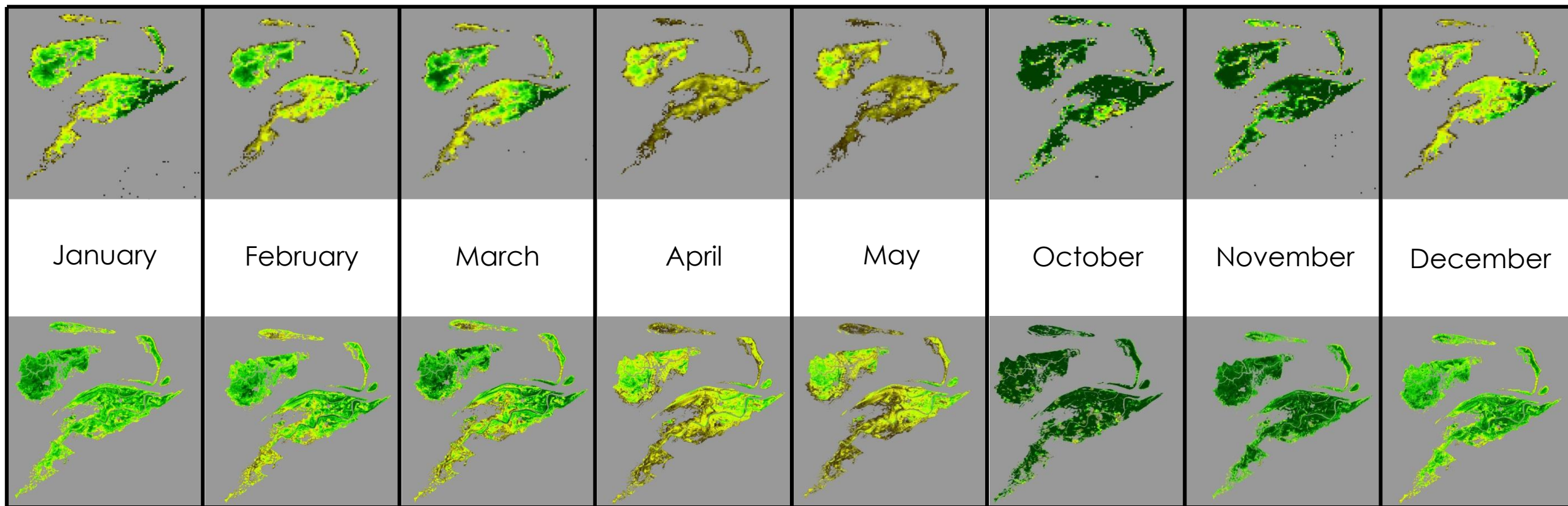
Chilika



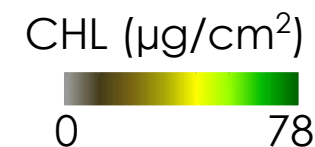


Results

CHL: Terra MODIS Composites (2013 – 2016)



CHL: Landsat 8 OLI Composites (2013 – 2016)

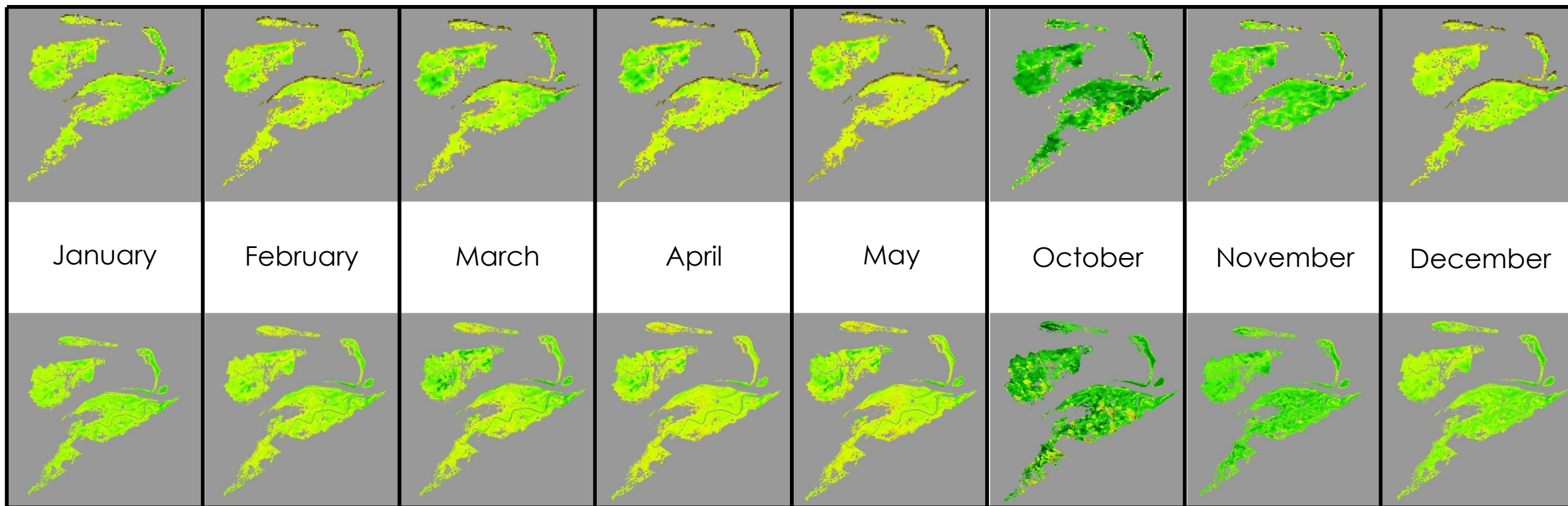


Source: Eastern India Ecological Forecasting



Results

GPP: Terra MODIS



GPP: Landsat 8 OLI

GPP (g-C/m^2)

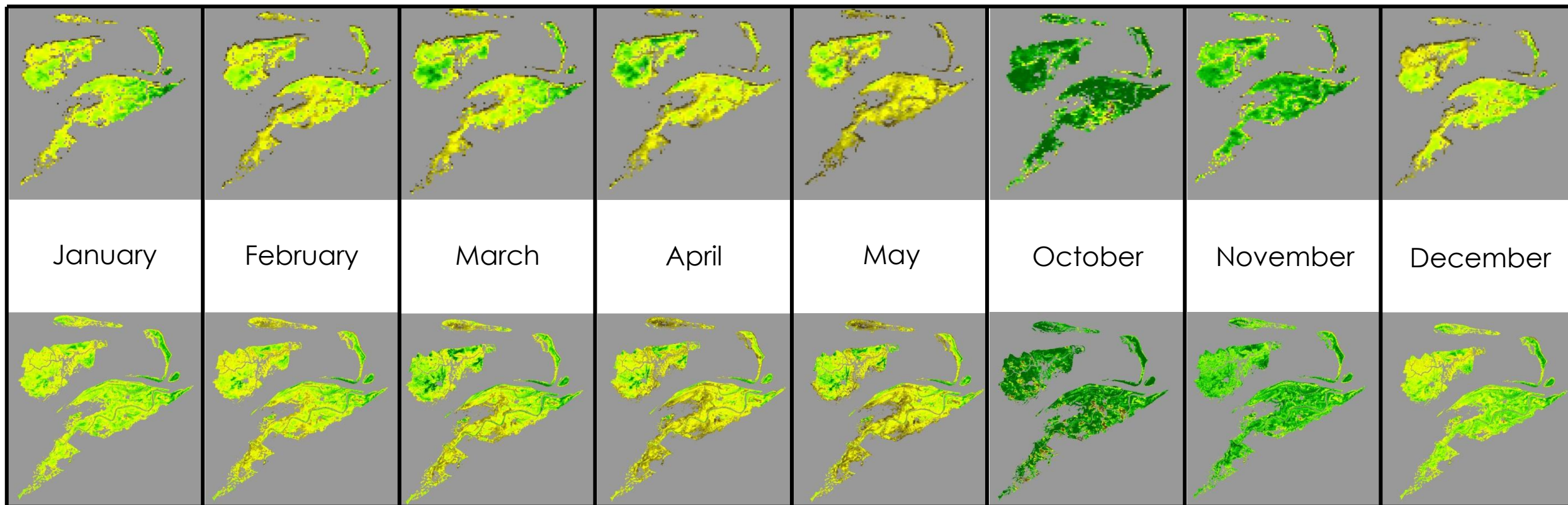
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Source: Eastern India Ecological Forecasting

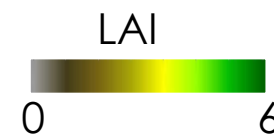


Results

LAI: Terra MODIS



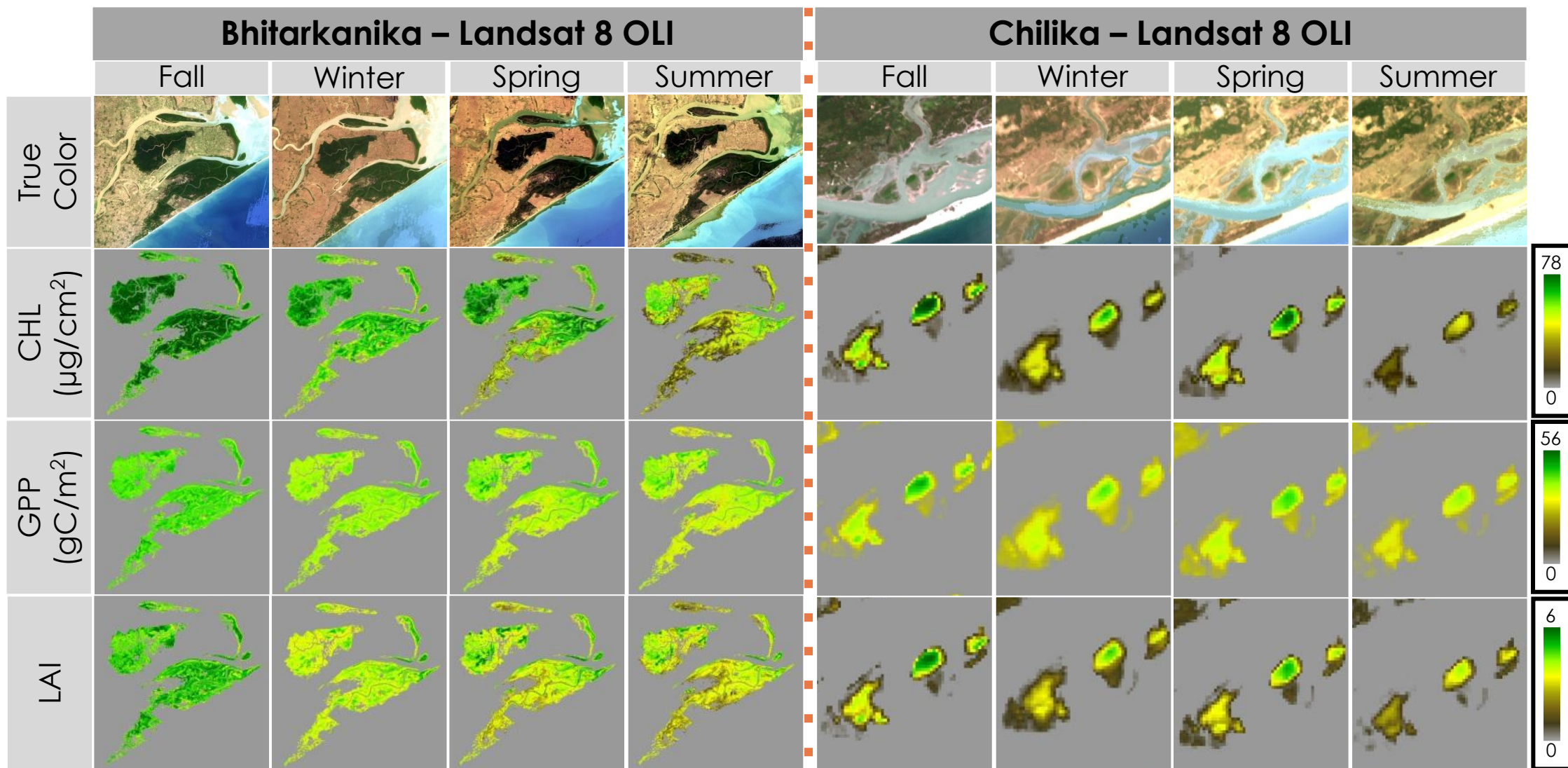
LAI: Landsat 8 OLI



Source: Eastern India Ecological Forecasting



Results

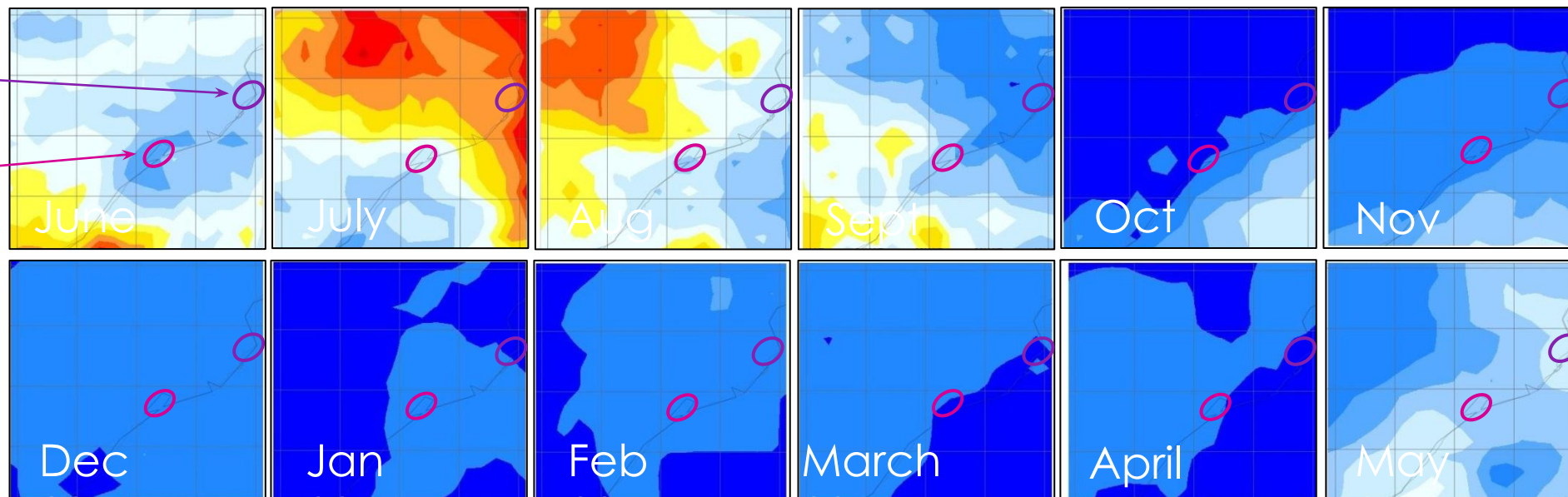




Results

Bhitarkanika

Chilika



Precipitation Results





Conclusion

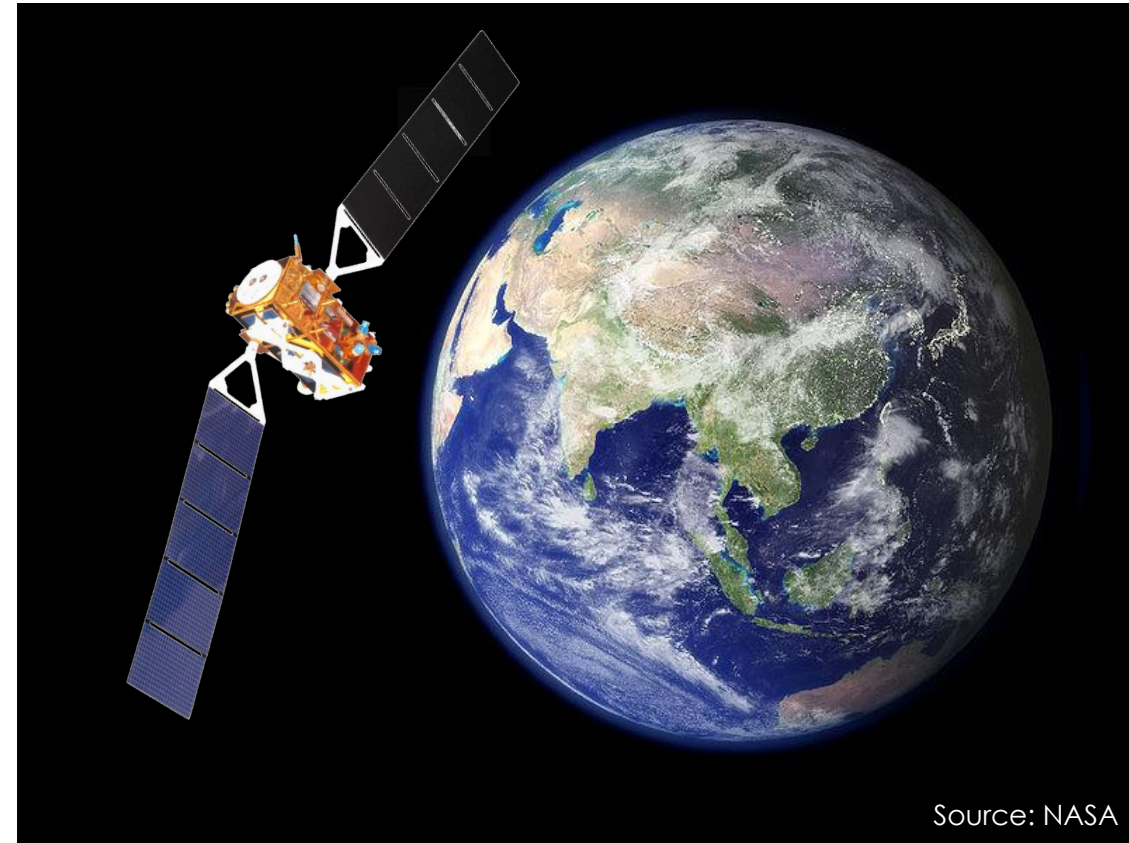
- 4 The methodology developed in this study can be used to **predict mangrove biophysical parameters**.
- 4 All biophysical parameters followed **a similar seasonal pattern**.
- 4 **Cross-calibration** was required for Top of Atmosphere (TOA) Products because they differ in **atmospheric correction technique**.
- 4 The **accuracy** of biophysical models can be further improved by incorporating **field data**.





Future Work

- 4 Incorporate **field data**.
- 4 Improve the **cross-calibration** of satellite sensors.
- 4 Utilize **radar data** to overcome cloudy satellite images.
- 4 Analyze the **factors** affecting mangrove health and seasonality.
- 4 **Classify** different types of mangrove in the study area using **hyperspectral data**.
- 4 Estimate **long-term change** in mangrove **land area coverage**.



Acknowledgements



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