

# Carbon Biomass Estimates using Remote Sensing



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2021 National Geographic Explorer



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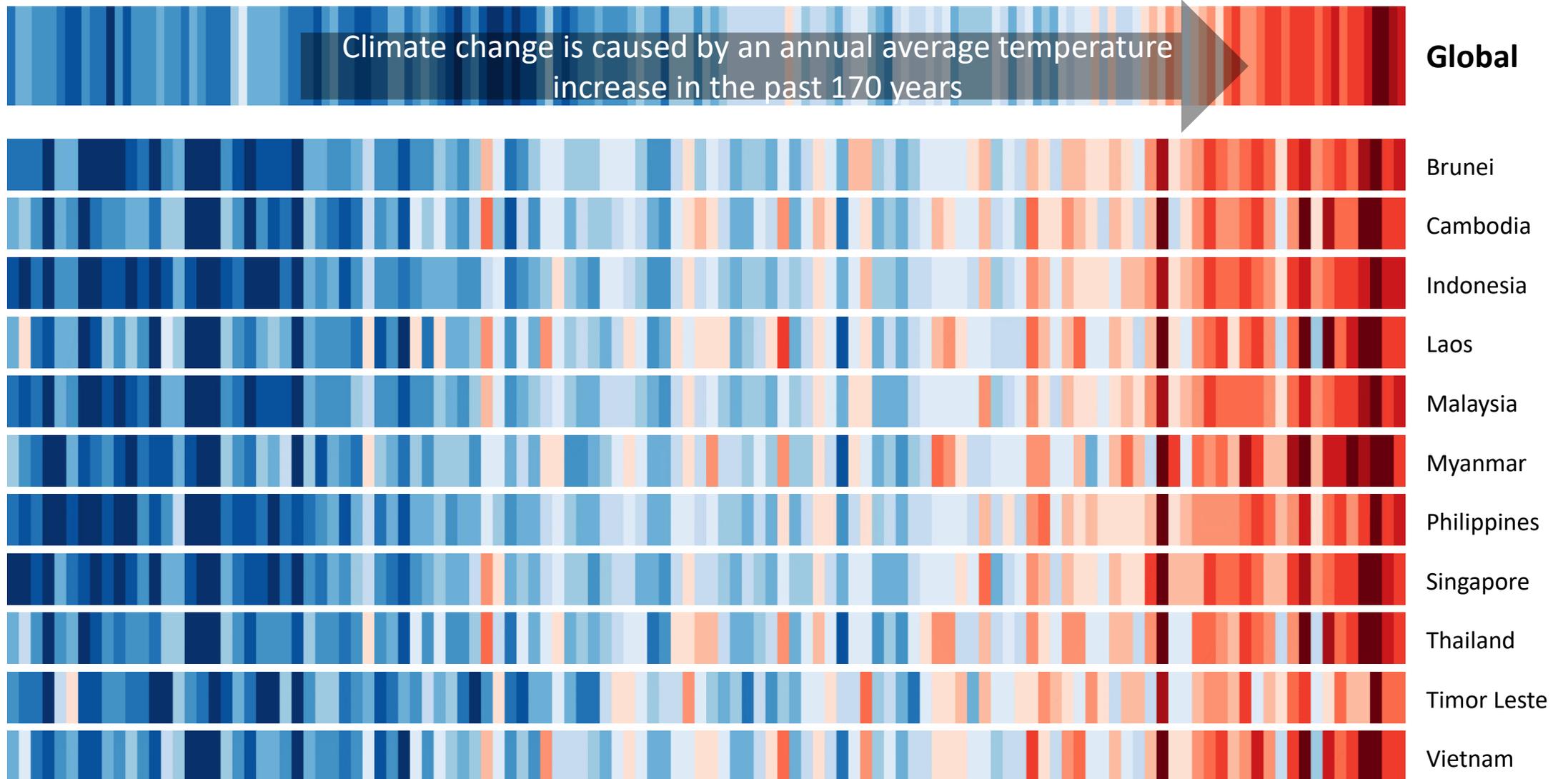


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# Climate Change



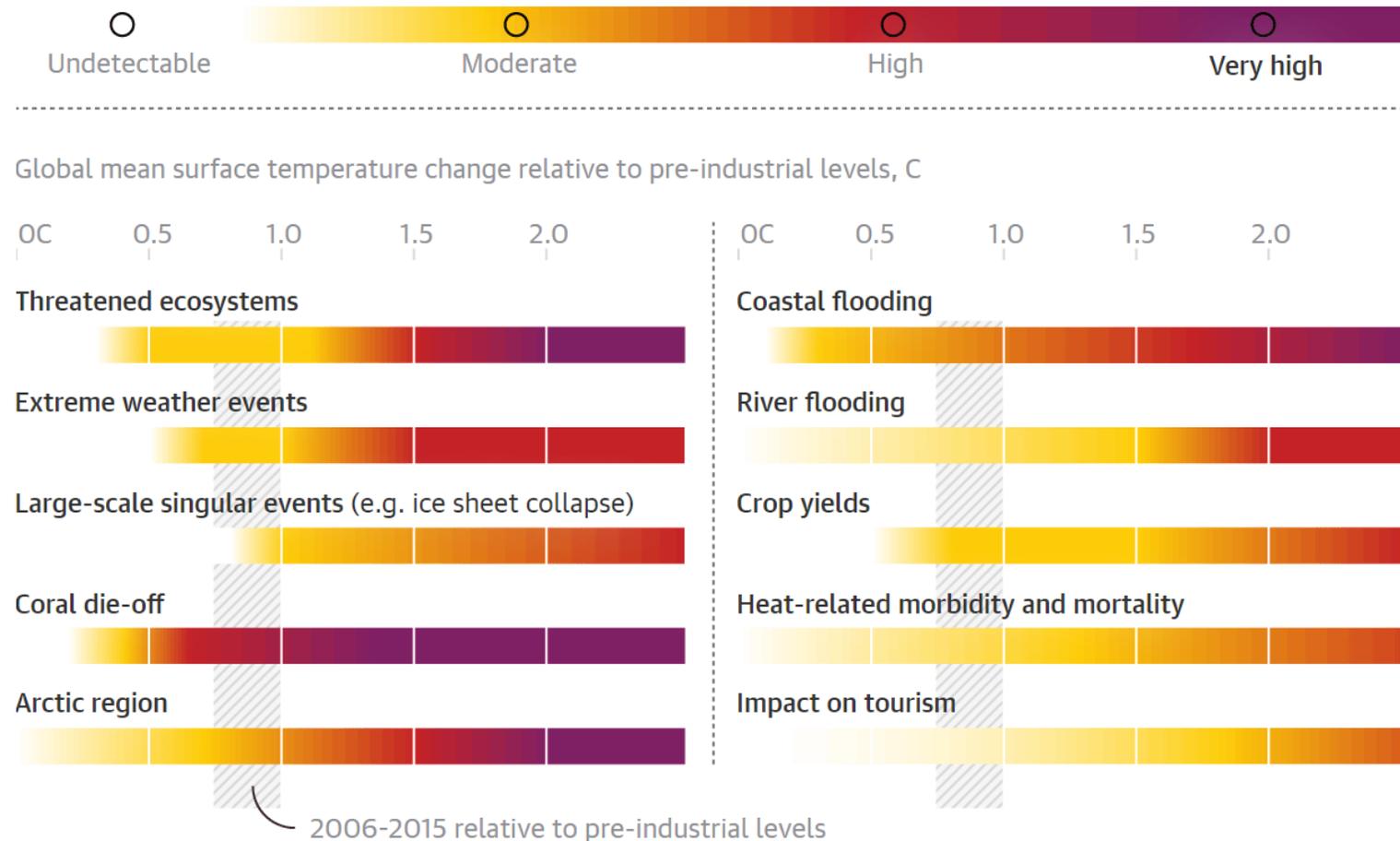
# Climate Change Impacts



The impact of climate change is seen worldwide in the form of forest fires, draughts, and floods.

# Future Climate Change Impacts

In the coming future, if the temperatures increase, the following are the likely impacts.



# Types of Forest Carbon

To reduce the impact of climate change, climate change mitigation through carbon sequestration of different forests is utilized.



Mangroves



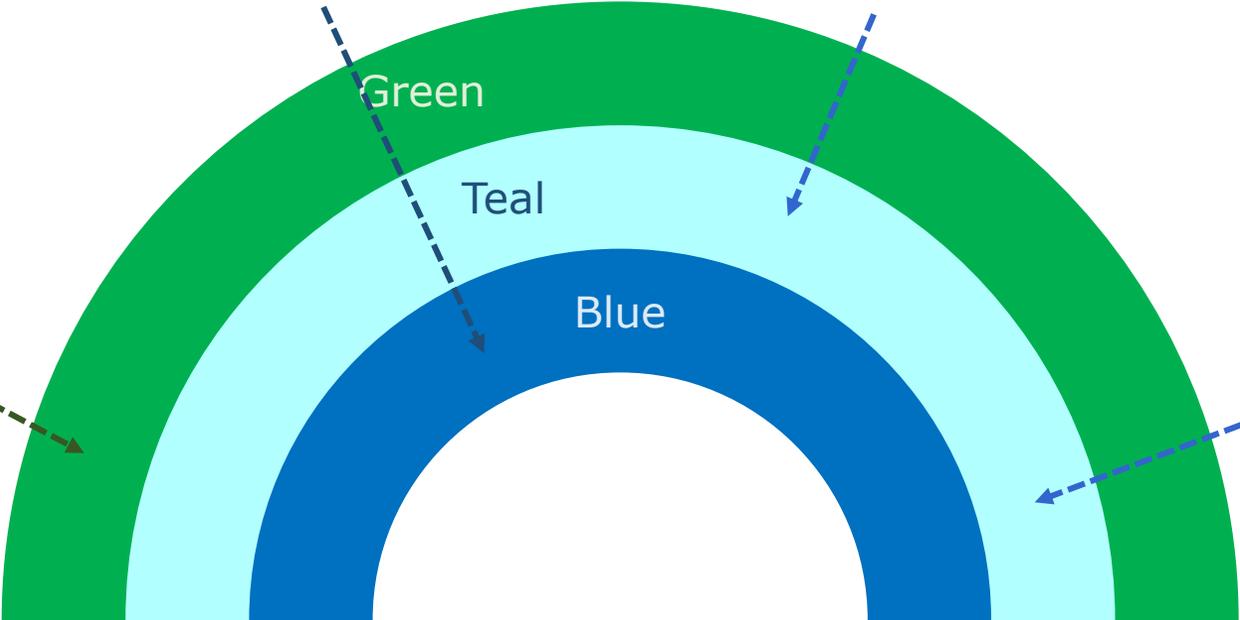
Freshwater swamp forest



Terrestrial forests  
(Deciduous & evergreen)



Peat swamp forest



# Storage, emissions, and sequestration of carbon

## Wetland Carbon Sequestration:

Carbon Storage:  
Mineral Soils and  
Organic Soils (Peat)

Trees and vegetation  
fix atmospheric  
carbon through  
photosynthesis

Trees and vegetation  
fix atmospheric  
carbon through  
photosynthesis

increased carbon  
sequestration

Disturbance of  
wetland soils  
and/or  
hydrology  
releases  
carbon

Carbon returns  
to the  
atmosphere  
through  
respiration and  
decomposition

Vegetation dies  
and sinks  
below water  
annually  
depositing  
carbon

Above  
ground  
carbon:  
branches,  
trunk,  
foliage

water  
table

MINERAL Soil Wetland

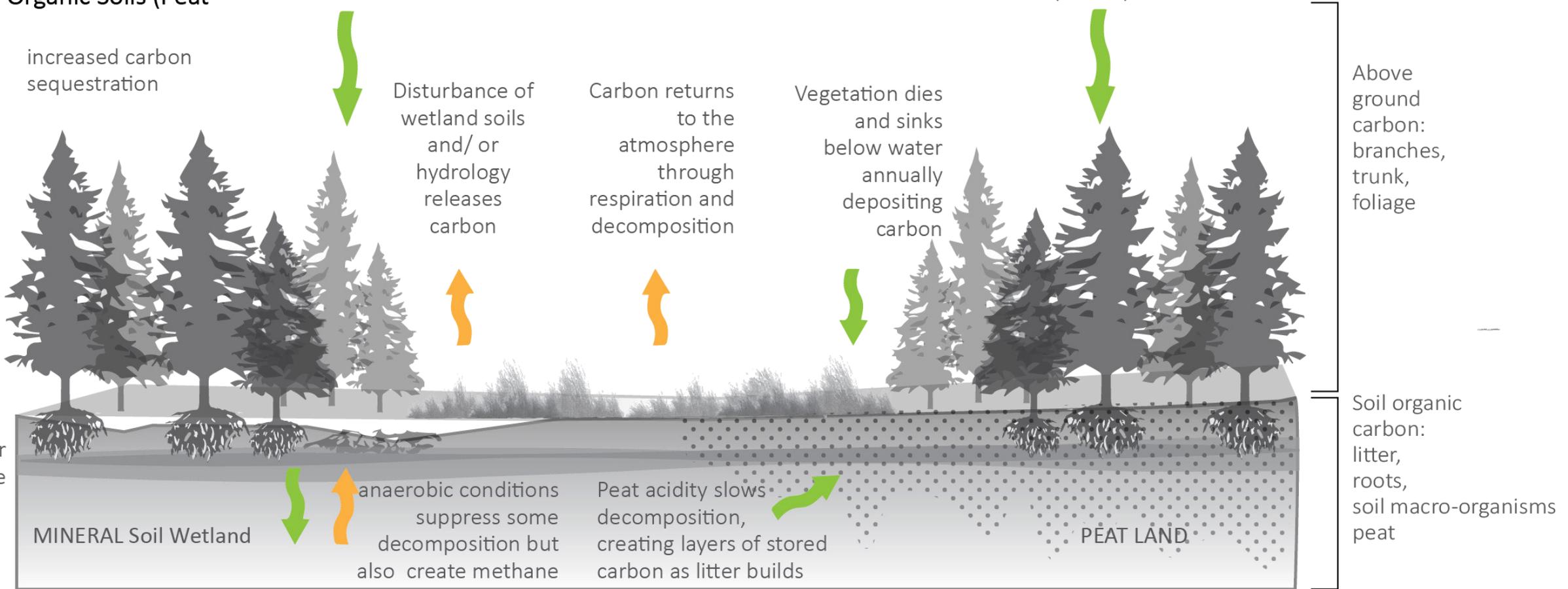
anaerobic conditions  
suppress some  
decomposition but  
also create methane

Peat acidity slows  
decomposition,  
creating layers of stored  
carbon as litter builds

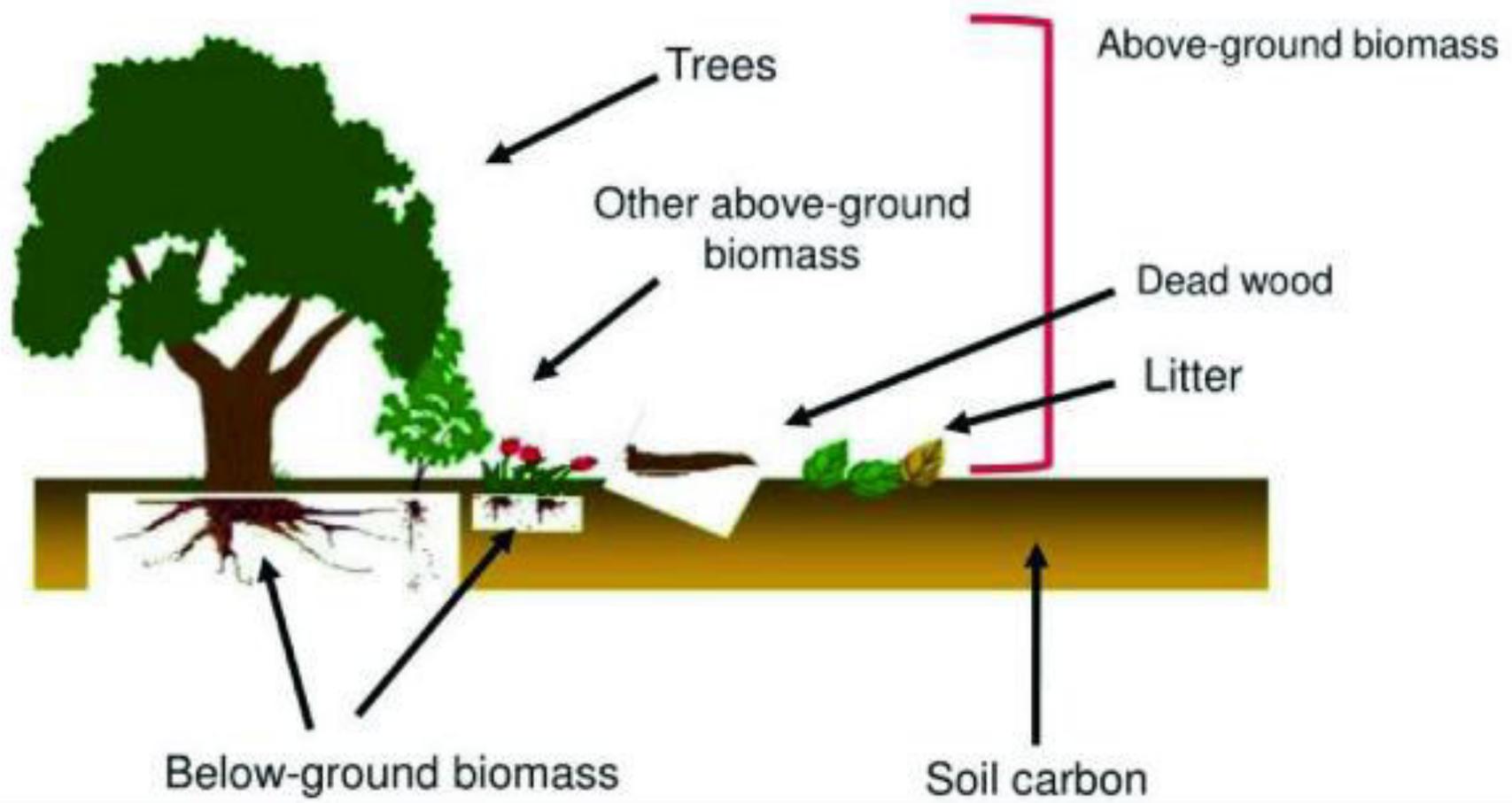
PEAT LAND

Soil organic  
carbon:  
litter,  
roots,  
soil macro-organisms  
peat

More stable carbon  
+ increased carbon sequestration



- The IPCC GPG (2003) - five carbon pools:  
aboveground biomass, belowground biomass, litter, dead wood, and soil organic carbon



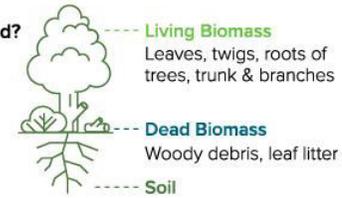
# Carbon Storage in Earth's Ecosystems

Achieving net-zero by 2050 depends on the Earth's natural carbon sinks.

Forests play a critical role in regulating the global climate. They absorb carbon from the atmosphere and then store it, acting as natural carbon sinks.

## Where is Carbon Stored?

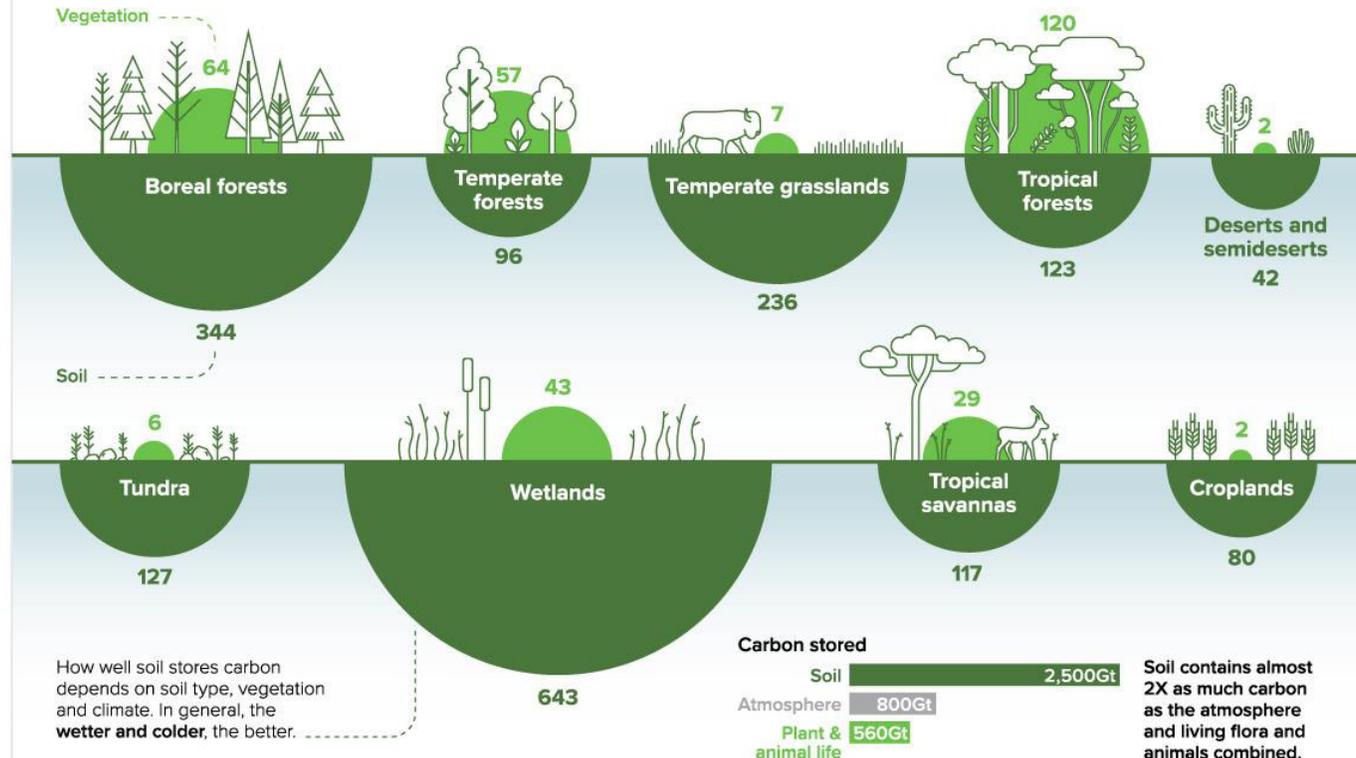
There are various carbon pools in a forest ecosystem.



## Carbon Storage Tonnes of Carbon

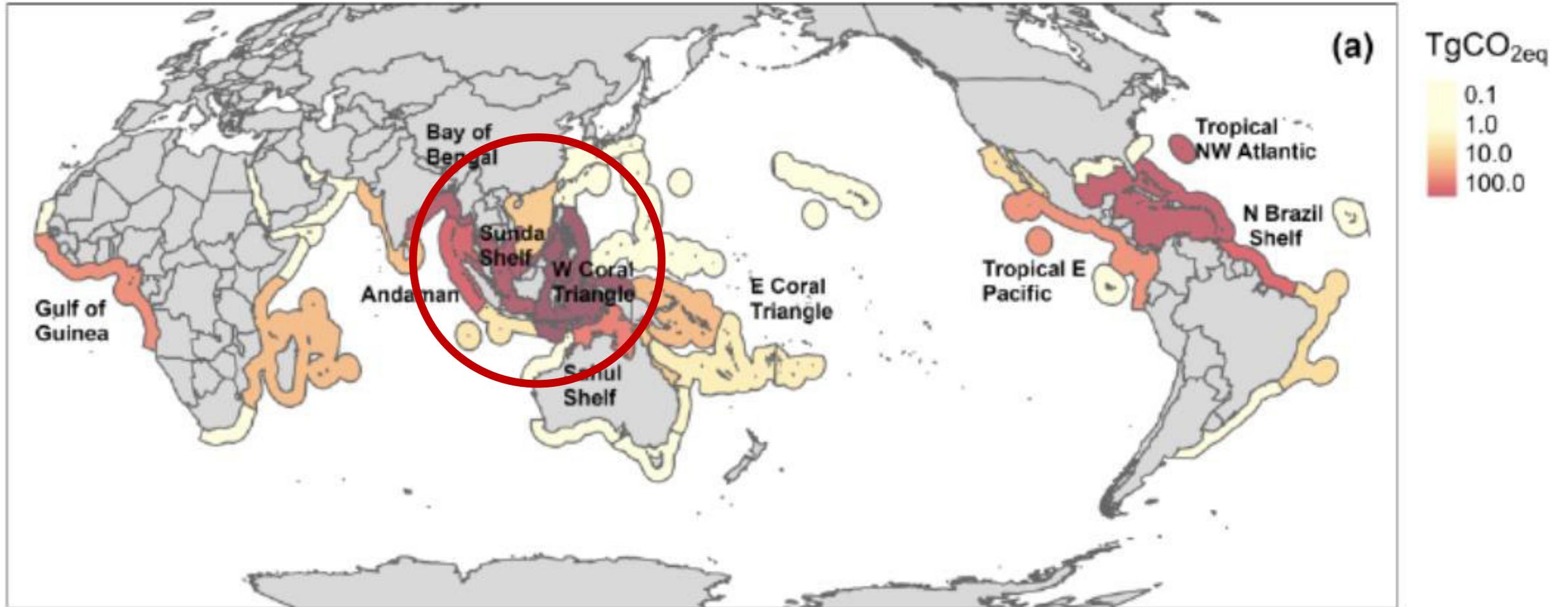
The world's forests absorb around **15.6 gigatonnes** of CO<sub>2</sub> each year. That's around 3X the annual CO<sub>2</sub> emissions of the United States.

However, around **8.1 gigatonnes of CO<sub>2</sub>** leaks back into the atmosphere due to deforestation, fires and other disturbances.



Average stored carbon in tonnes per hectare at a ground depth of one meter  
Sources: IPCC; NASA

# Carbon Emissions due to Mangrove Deforestation

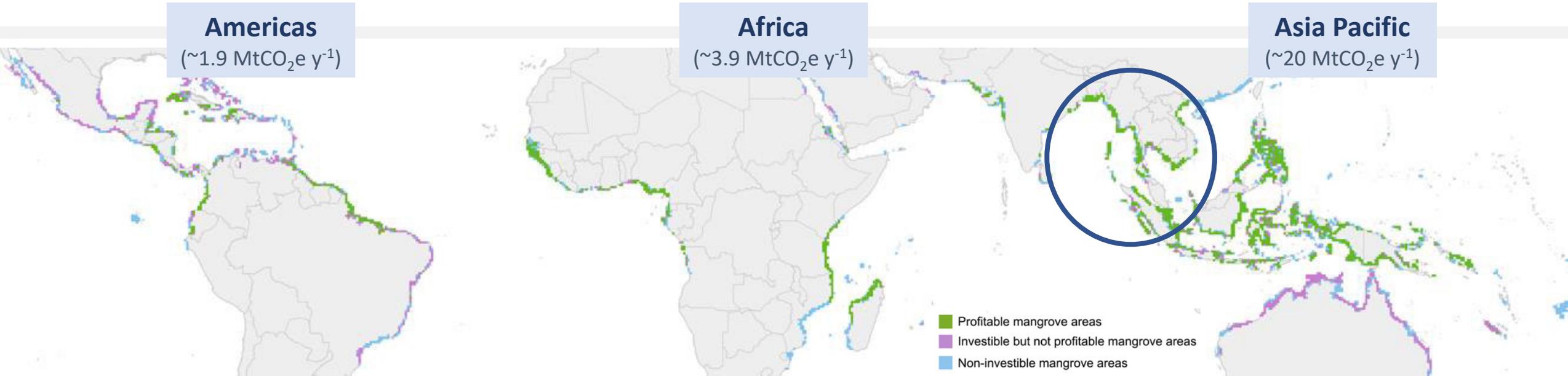


Adame et al. 2021. *Global Change Biology* 27, 2856-2866.

Mangrove deforestation emissions + lost sequestration could be 3392 TgCO<sub>2</sub>-e by 2100

# Where are the Opportunities for NCS?

Southeast Asia has tremendous potential for profitable blue carbon



## Blue Carbon Prospecting (Protecting Threatened Mangroves)



**United Nations**  
Framework Convention on  
Climate Change



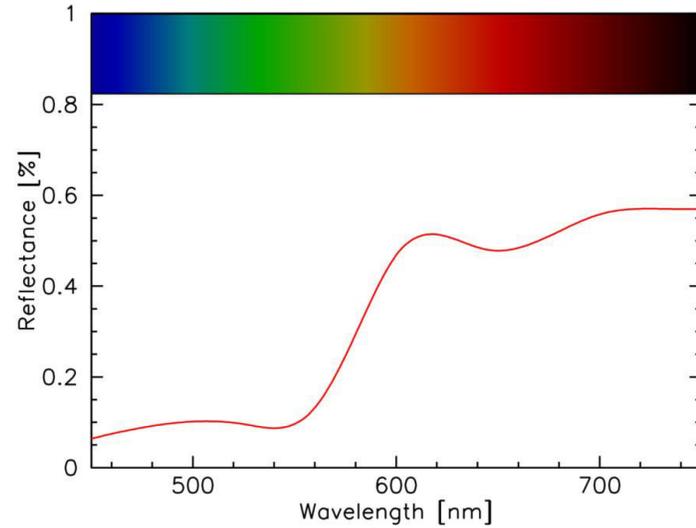
PARIS2015  
UN CLIMATE CHANGE CONFERENCE  
COP21·CMP11

- 17 countries where **mangrove** carbon sequestration offsets >5% of national greenhouse gas emissions
- 17 countries where **mangrove** carbon sequestration offsets 1-5% of national greenhouse gas emissions





Satellites revolving around the Earth emit wavelengths and detect reflectance from the Earth's surface



Using reflectance, several indices can be created which give information about Earth's surface, for example, wetlands.



These indices can be used to create models, for example to detect carbon biomass

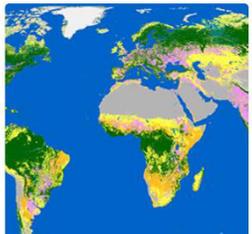
Using satellite data to estimate carbon storage in wetlands of Southeast Asia

# Estimated values of stored carbon

- Above-ground biomass (MgC/hectare, uncertainty)
- Below-ground biomass (MgC/hectare, uncertainty)
- Soil Organic Carbon (5g/kg)
- Leaf Litter
- Dead Wood
- Loss in forest area (km sq.)
- Gain in forest area (km sq.)
- Loss in carbon estimated by loss in forest cover\* (MgC/hectare, uncertainty)
- Gain in carbon estimated by gain in forest cover\* (MgC/hectare, uncertainty)

# Datasets

## ESA WorldCover 10m v200

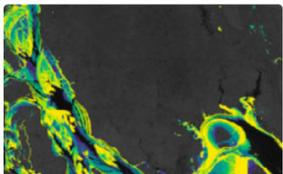


DESCRIPTION BANDS TERMS OF USE CITATIONS

The European Space Agency (ESA) WorldCover 10 m 2021 product provides a global land cover map for 2021 at 10 m resolution based on Sentinel-1 and Sentinel-2 data. The WorldCover product comes with 11 land cover classes and has been generated in the framework of the ESA WorldCover project, part of the 5th Earth Observation Envelope Programme (EOEP-5) of the European Space Agency.

See also:

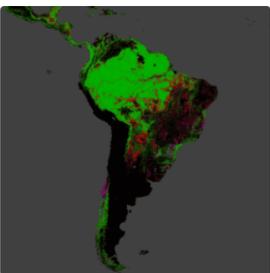
## Murray Global Intertidal Change Classification



DESCRIPTION BANDS TERMS OF USE CITATIONS DOIS

The Murray Global Intertidal Change Dataset contains global maps of tidal flat ecosystems produced via a supervised classification of 707,528 Landsat Archive images. Each pixel was classified into tidal flat, permanent water or other with reference to a globally distributed set of training data.

## Hansen Global Forest Change v1.10 (2000-2022)



DESCRIPTION BANDS TERMS OF USE CITATIONS DOIS

Results from time-series analysis of Landsat images in characterizing global forest extent and change.

The 'first' and 'last' bands are reference multispectral imagery from the first and last available years for Landsat spectral bands corresponding to red, NIR, SWIR1, and SWIR2. Reference composite imagery represents median observations from a set of quality-assessed growing-season observations for each of these bands.

Please see the [User Notes](#) for this Version 1.10 update, as well as the associated journal article: Hansen, Potapov, Moore, Hancher et al. "High-resolution global maps of 21st-century forest cover change." Science 342.6160 (2013): 850-853.

Dataset Availability

2000-01-01T00:00:00 - 2022-01-01T00:00:00

Dataset Provider

[Hansen/UMD/Google/USGS/NASA](#)

Collection Snippet 

```
ee.Image("UMD/hansen/global_forest_change_2022_v1_10")
```

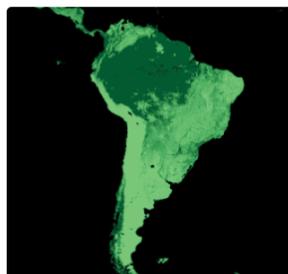
[See example](#)

Tags

CLOSE

IMPORT

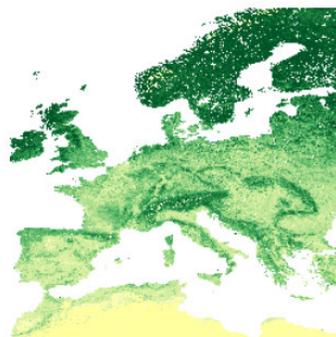
## Global Aboveground and Belowground Biomass Carbon Density Maps



DESCRIPTION BANDS TERMS OF USE CITATIONS DOIS

This dataset provides temporally consistent and harmonized global maps of aboveground and belowground biomass carbon density for the year 2010 at a 300-m spatial resolution. The aboveground biomass map integrates land-cover specific, remotely sensed maps of woody, grassland, cropland, and tundra biomass. Input maps were amassed from the published literature and, where necessary, updated to cover the focal extent or time period. The belowground biomass map similarly integrates matching maps derived from each aboveground biomass map and land-cover specific empirical models. Aboveground and

## OpenLandMap Soil Organic Carbon Content



DESCRIPTION BANDS TERMS OF USE CITATIONS DOIS

Soil organic carbon content in x 5 g / kg at 6 standard depths (0, 10, 30, 60, 100 and 200 cm) at 250 m resolution

Predicted from a global compilation of soil points. Processing steps are described in detail [here](#). Antarctica is not included.

To access and visualize maps outside of Earth Engine, use [this page](#).

If you discover a bug, artifact or inconsistency in the LandGIS maps or if you have a question please use the following channels:

- [Technical issues and questions about the code](#)
- [General questions and comments](#)

Dataset Availability

1950-01-01T00:00:00 - 2018-01-01T00:00:00

Dataset Provider

[EnvirometriX Ltd](#)

Collection Snippet 

```
ee.Image("OpenLandMap/SOL/SOL_ORGANIC-CARBON_USDA-6A1C_M/v02")
```

[See example](#)

Tags

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# Data analysis notes



## Land use Dynamics

ESA World Cover 2021, Hansen Gain and Loss data are aggregated over the site boundaries by landcover classes

Accuracy : ~70%

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## Vegetative Carbon

AGB and BGB values: aggregated over landcover class areas

Uncertainty: mean for each class

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## Soil Carbon

Density (g/kg) : aggregated sum for each landcover class and at each depth, presented as a range.

Biomass: aggregated mean of all points at different depths, normalized for the area of each landcover class

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## Carbon sequestration rate:

Normalized using global estimates per landcover class available in literature reviews

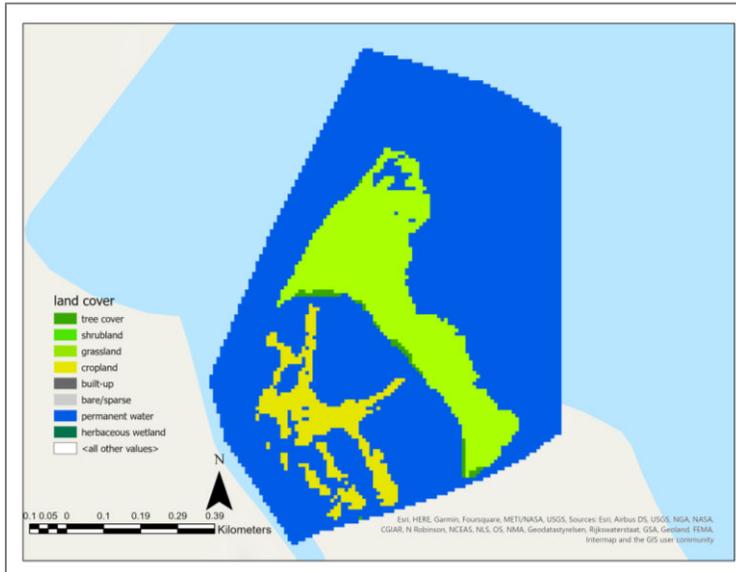
# Bangrin Marine Protected Area, Philippines

Total Area: 160.6 ha

Total C: 6.3 MgC

Vegetative C: 0 +/- 0 MgC

Soil C: 6.3 MgC



Landcover Dynamics				Vegetative Carbon				Soil Carbon		Carbon sequestration Rate		
Landcover type	Area (ha)	Gain (ha)	Loss (20-75% tree cover) (ha)	AGB (MgC)	Uncertainty (MgC)	BGB (MgC)	Uncertainty (MgC)	SOC Range (g/kg)	SOC (MgC)	Total C seq MgC/y	Min C seq rate (MgC y-1)	Max C seq rate (MgC y-1)
Tree cover	0.6	0	0	0	0	0	0	155-180	0.045	0.24	0.17	0.17
Shrubland	0	0	0	0	0	0	0	0	0	No Data	No Data	No Data
Grassland	13	0	0	0	0	0	0	155-180	1.01	2.24	0.65	0.81
Cropland	5	0	0	0	0	0	0	85-105	0.23	No Data	No Data	No Data
Permanent water	60	Na	Na	Na	Na	Na	Na	Na	Na	Na	Na	Na
Herbaceous wetlands	0	0	0	0	0	0	0	0	0	0	0	0
Mangroves	0	0	0	0	0	0	0	0	0	91.52	66.80	238.58
Aquaculture	0	0	0	0	0	0	0	0	0	No Data	No Data	No Data
Tidal flat	82	0	0	0	0	0	0	110-125	5.03	0	0	0

Landcover type	Reference	Notes
Landcover Type and Area (ha)	European Space Agency (ESA) World Cover 10m 2021	All landcover classes except aquaculture and tidal flat are derived from ESA dataset
Aquaculture	Clark	Clark
Tidal Flat	Murray Global Intertidal Change Classification 2017	Extent of tidal flats from the year 2017
Gain in tree cover (ha)	Hansen Global Forest Change v1.10 (2000-2022)	Gain is defined by a gain in tree cover for 2000-2012
Loss in 20-75% tree cover (ha)	Hansen Global Forest Change v1.10 (2000-2022)	Loss is presented as a loss in 20% to 75% tree cover between 2000-2022
Vegetative Carbon	Global Aboveground and Belowground Biomass Carbon Density Maps (2010)	Vegetative Carbon is a sum of aboveground and belowground carbon derived from the given dataset estimated through geospatial analysis
Soil Carbon	OpenLandMap Soil Organic Carbon Content 2018	Soil Carbon is presented as a density (g/kg) and total amount in MgC. The OpenLandMap soil carbon map predicts global values through a compilation of soil data points.
Carbon Sequestration	Taillardat et al. 2018 and Chen and Lee 2022	Taillardat et al 2018 are used for mangroves, herbaceous wetlands, tree cover, and shrubland. Chen and Lee 2022 are used for tidal flats. These are global estimates used to do a value conversion based on area per landcover.

\*The landcover dynamics are determined using global geospatial datasets. It is possible that certain landcover classes are over or under estimated or ignored due to dataset limitations. We advise that the geospatial analysis be supplemented with ground reference points.

# Following additional classes were identified during stakeholder consultations:

- Estuarine waters
- Intertidal mud, sand, or saltflats
- Intertidal forested wetlands

These classes could overlap or have different ways of defining current landcover classes.

# Bangrin Tidal flats





# Carbon Biomass Estimates using Remote Sensing Thank you!

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