



# NASA Biodiversity Project



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Soundscapes – Animal Diversity & Assist with  
Silent Remote Sensing + Develop Framework

Biodiversity Metrics for  
Plants and Animals + *in situ*  
Forest Diversity Data

UAV and ISS Remote  
Sensing Analysis



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# Overarching Objective

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Our vision is to use three ISS sensor platforms (GEDI, DESIS and ECOSTRESS), a variety of space-based remote sensing platforms (e.g., MODIS, Landsat, ICESat 1/2), *in situ* acoustic sensor data, and an assortment of other “silent” *in situ* data (field surveys, national and regional forest inventory data, UAV data, and meteorological data) to build a **multi-sensor biodiversity modeling framework** that is applied to major terrestrial global biomes.

- Animal + Plant Biodiversity Model



# Hypotheses

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Hypotheses. We will use a variety of space-based, UAV-based and *in situ*-based sensors to characterize the relationship between habitat features (structure, composition, and condition) and animal biodiversity across space, time and disturbances at eleven acoustic study locations as well as tree species diversity survey data within nine Köppen-Gieger climate zones:

H1: **Habitat structure** moderates animal acoustic diversity across all time frames (hourly, daily, seasonal and annual) and in all biomes, and, in particular,

H1.1 Habitat loss (i.e., area) correlates strongly with animal acoustic diversity across all time frames (hourly, daily, seasonal and annual) and in all biomes

H1.2 Fragmentation of habitat does not correlate with animal acoustic diversity as measured across all time frames and in all biomes

H1.3 Vertical habitat structural complexity positively correlates with animal acoustic diversity

H2: Animal acoustic diversity is positively correlated with diversity of **vegetation composition**

H2.1 That an array of space-based platforms strongly predicts tree diversity from in situ measurements

H2.2 That animal acoustic diversity strongly correlates with tree diversity

H2.3 That animal acoustic diversity strongly correlates with space-based vegetation composition measures

H3: **Vegetation condition** drives animal activity patterns, and, in particular,

H3.1 Peak greening of vegetation during the year is synchronized with peak of acoustic activity of all animals for all biomes

H3.2 Across any landscape where vegetation stress is variable, the greatest animal acoustic activity will be located in areas of least vegetation stress

H3.3 In ecosystems that are characterized by brief rainfall events (e.g., deserts, grasslands, mangroves), the peak animal acoustic activity will occur after the rainfall event and when plant stress is low

H4: **Biogeographic trends** in plant and animal diversity, using regional to global scale comparisons, will be consistent with a variety of known global patterns:

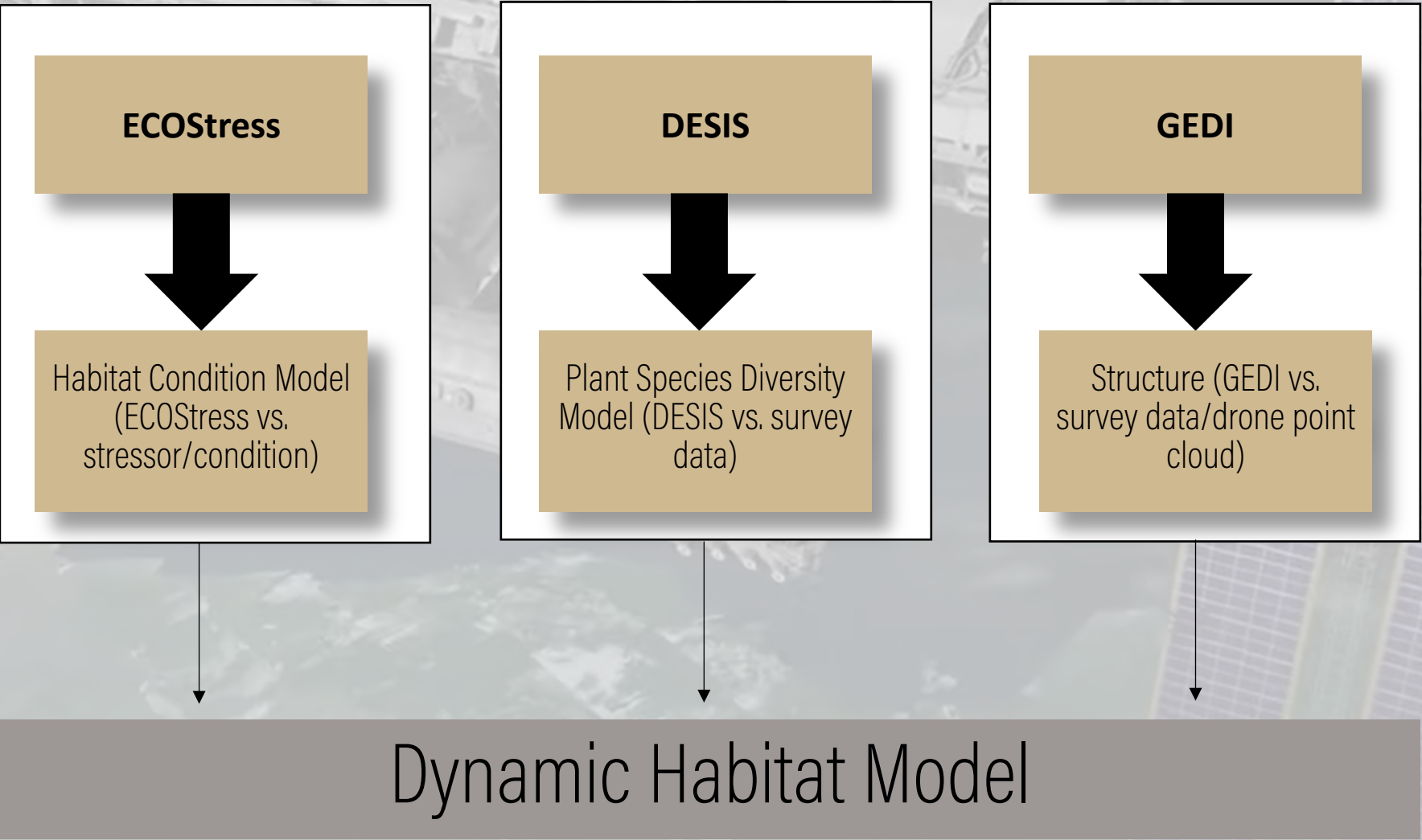
H4.1 Species richness for animals and plants will be greatest in equatorial regions and decline as one moves to higher latitudes

H4.2 Activity patterns of animals will be greatest in reference habitats and decline with increasing human activity

H4.3 Vegetation composition spectral signatures and acoustic signals will follow the well-known species area curve



# ISS-based Sensor Habitat Models



# Sites

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## Mongolia Forest-Steppe Study (ASIAN STEPPE)

Interfaces to an NSF Coupled Natural Human Systems 2 project in the central highlands and the western mountain regions.

Collecting data on herder practices as it relates to coupling of sonic-silent variables important to their lifeways and lived experiences

Ethnographic study on sonic practices.

## Bangladesh Sundarbans Mangrove Study (MANGROVES)

7 sites at Swapan Kumar's 200+ mangrove forest 20 year inventory study in the Sundarbans (UNESCO site)

Sites span low to high tree diversity based on his long-term data over a very large area

Need to expand this to 25 locations strategically placed (1 month long study)

# Sites

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## Tippecanoe Soundscape Study (TEMPERATE FOREST)

7 sites at Purdue properties that have been recording since 2008

Sites include old growth forest, secondary forest, urban forest, two ag sites, wetland and one old orchard

Need to expand this to 25 locations strategically placed  
(2 year long study)

## Tanzania Miombo Woodland Study (WOODLANDS)

7-9 sites at UCL's Issa Valley Miombo woodlands that have been recording since Feb 2017

Sites include marginal woodlands (< 50% canopy cover) and riparian woodlands (> 80% cover)

Need to expand this to 25 locations strategically placed  
(1-2 month long study)

# Major Highlights of Last 12 Months

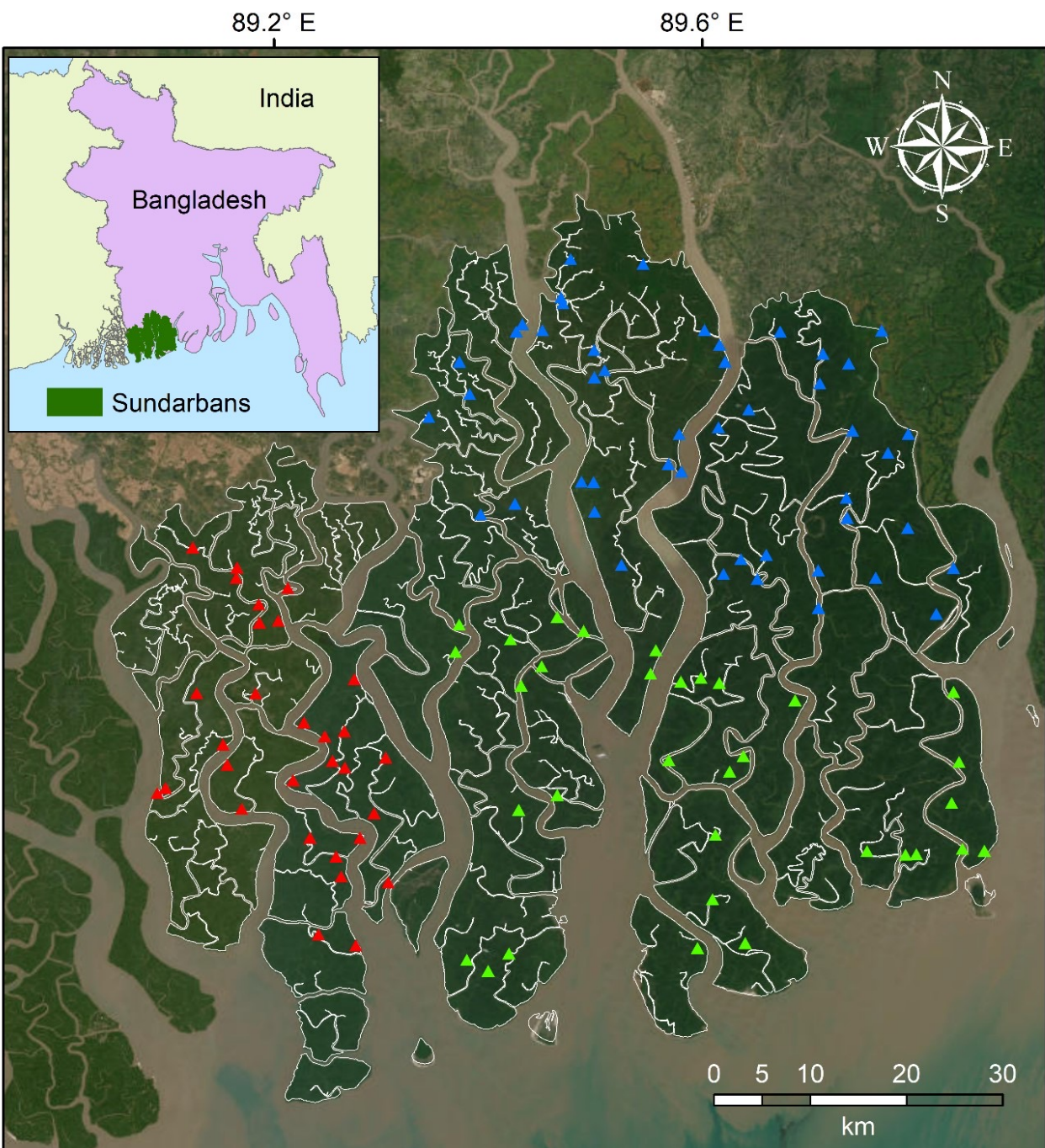
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1. Two published, three papers in review, many more coming
2. Have DESIS-based habitat species diversity model ✓
3. Preliminary GEDI habitat structural complexity model ✓
4. Moved to using CNN-based BirdNET to identify all bird calls
5. Using transfer learning, we now have OrthopteraNET, FrogNET, and ChimpNET built
6. Preliminary avian acoustics phenology models ✓
7. Assembling all of these tools into package called TidyAcoustics ✓



# 1. DESIS MODEL FOR MANGROVES IN BANGLADESH





# Mangroves of the Sundarbans Protected Area

110 Permanent Survey Plots

Data collected at each plot (10m x 110m)  
Tree species, dbf and abundances  
Condition of tree (healthy, diseased, dying, dead)  
Canopy height  
Soil salinity  
Taken every 5 years since 1983

Blue = hyposaline (low salinity)  
Green = mesosaline (medium salinity)  
Red = hypersaline (high salinity)



# Spectral Species Model Using DESIS, Landsat and Sentinel-2

Reducing the dimensionality of the Hyperspectral Data using Principal Component Analysis



Unsupervised k-means clustering on the first three Principal Components



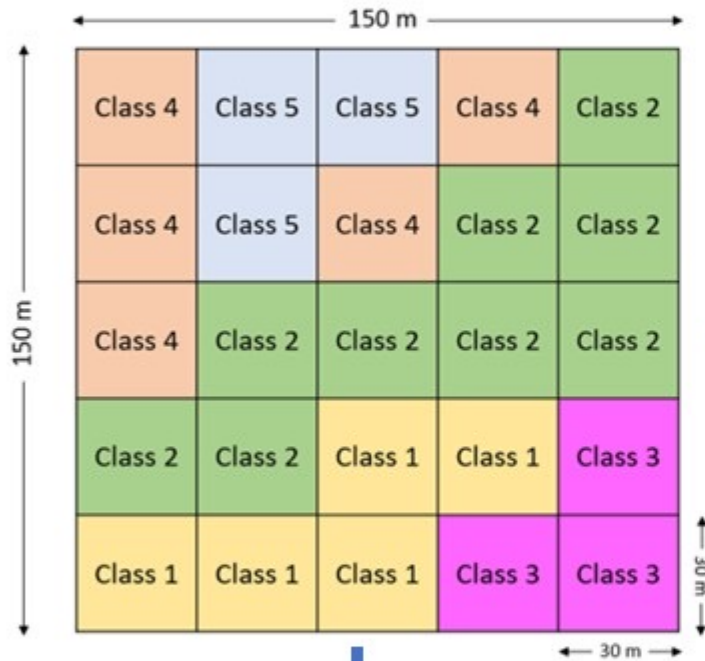
Determine Optimal number of Clusters (Spectral Species) using heuristic elbow method



Every image pixel (30 meters) is assigned to one Spectral Species Class



Create Spectral Spaces of 150-m x 150-m that consist of 25 image pixels of 30-m



Compute Spectral Species Diversity of Spectral Spaces using Shannon Entropy Equation



Generate Spectral Species Diversity map of Study area at 150-m spatial resolution

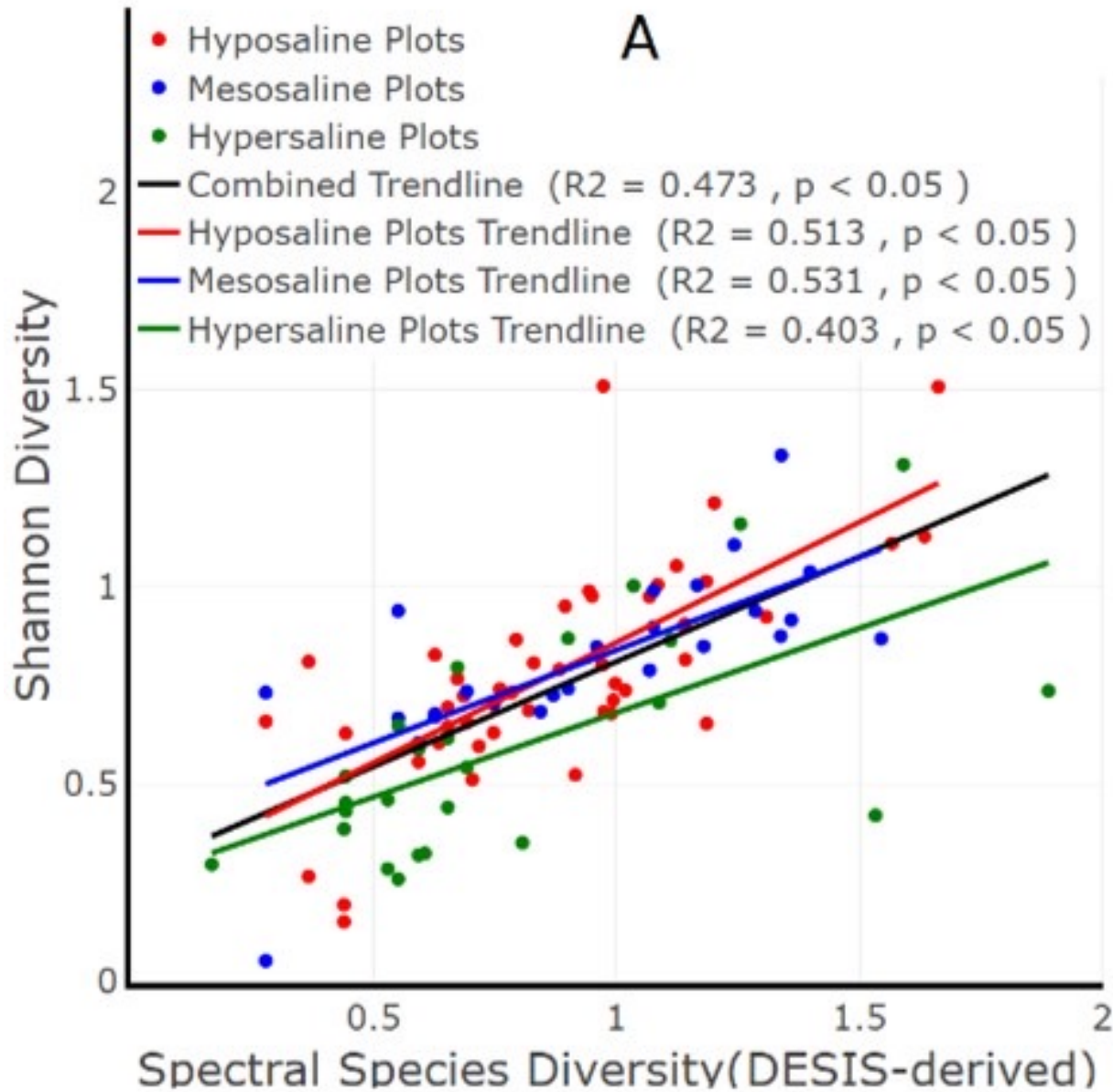


Extract Spectral Species Diversity values for the Permanent Sampling Plots

# Analysis of Spectral Species Model

- Spectral species  $\rightarrow$  Species Richness ( $q=0$ )  $\rightarrow$  Shannon's Diversity ( $q=1$ )  $\rightarrow$  Simpson's Diversity ( $q=2$ )
- Coefficient of variation of band values  $\rightarrow$  Species Richness ( $q=0$ )  $\rightarrow$  Shannon's Diversity ( $q=1$ )  $\rightarrow$  Simpson's Diversity ( $q=2$ )
- Examined these relationships also in three salinity zones

# Mangroves of the Sundarbans Protected Area



Hypothesis 1.1 was that there should be a positive relationship between Spectral Species Diversity and Plant Survey Diversity (shown here as Shannon Diversity,  $q=1$ )

Cannot reject

Hypothesis 1.2 that hyposaline should have greater values (red line), followed by mesosaline (blue line) and then hypersaline (green line)

Cannot reject

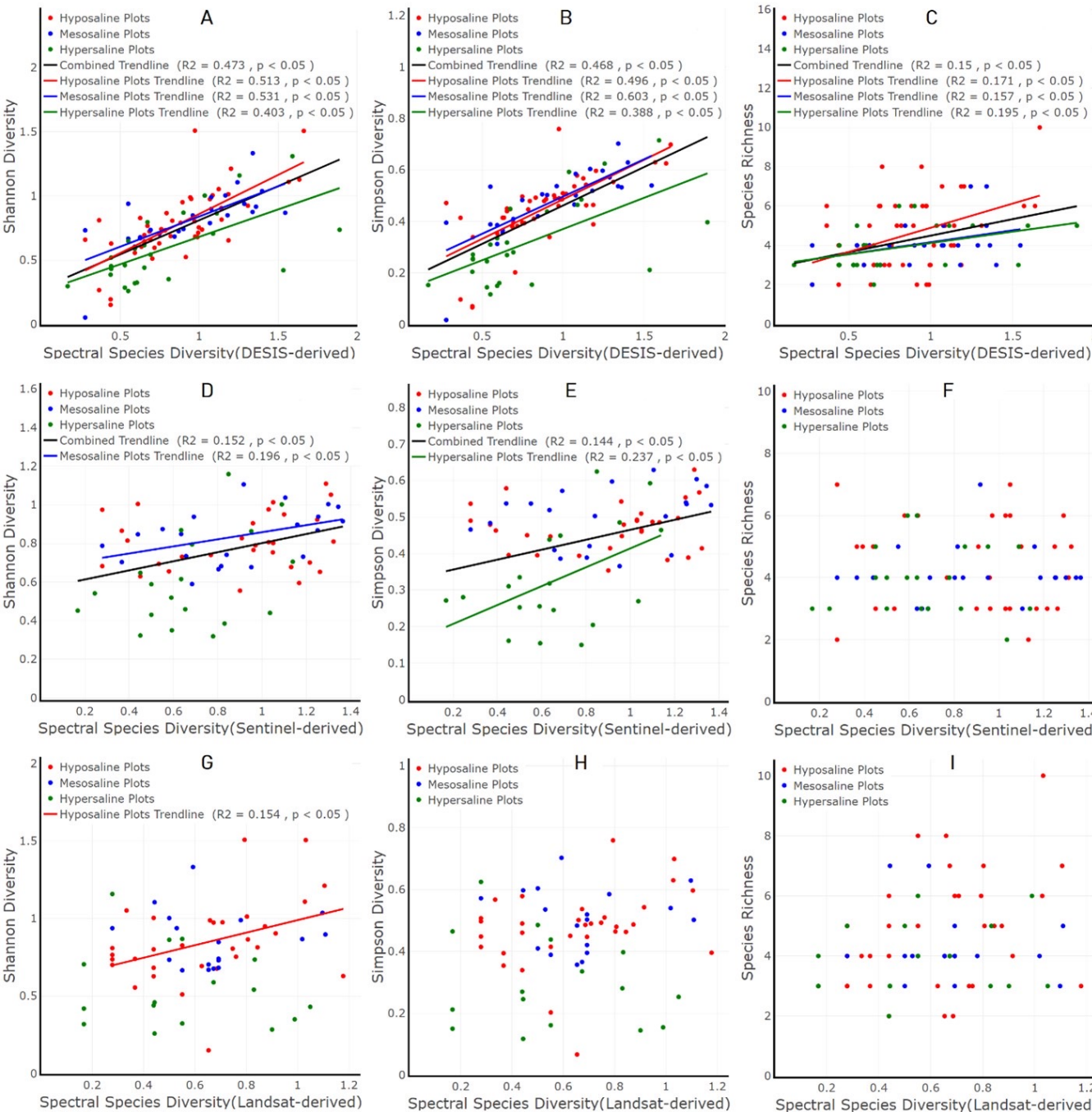


q=1

q=2

q=0

# Mangroves of the Sundarbans Protected Area



Hypothesis 1.3 was greater Hill numbers for measures of species diversity should provide more power.

Cannot reject

Hypothesis 1.4 that hyperspectral imagery should perform better than multispectral imagery

Cannot reject

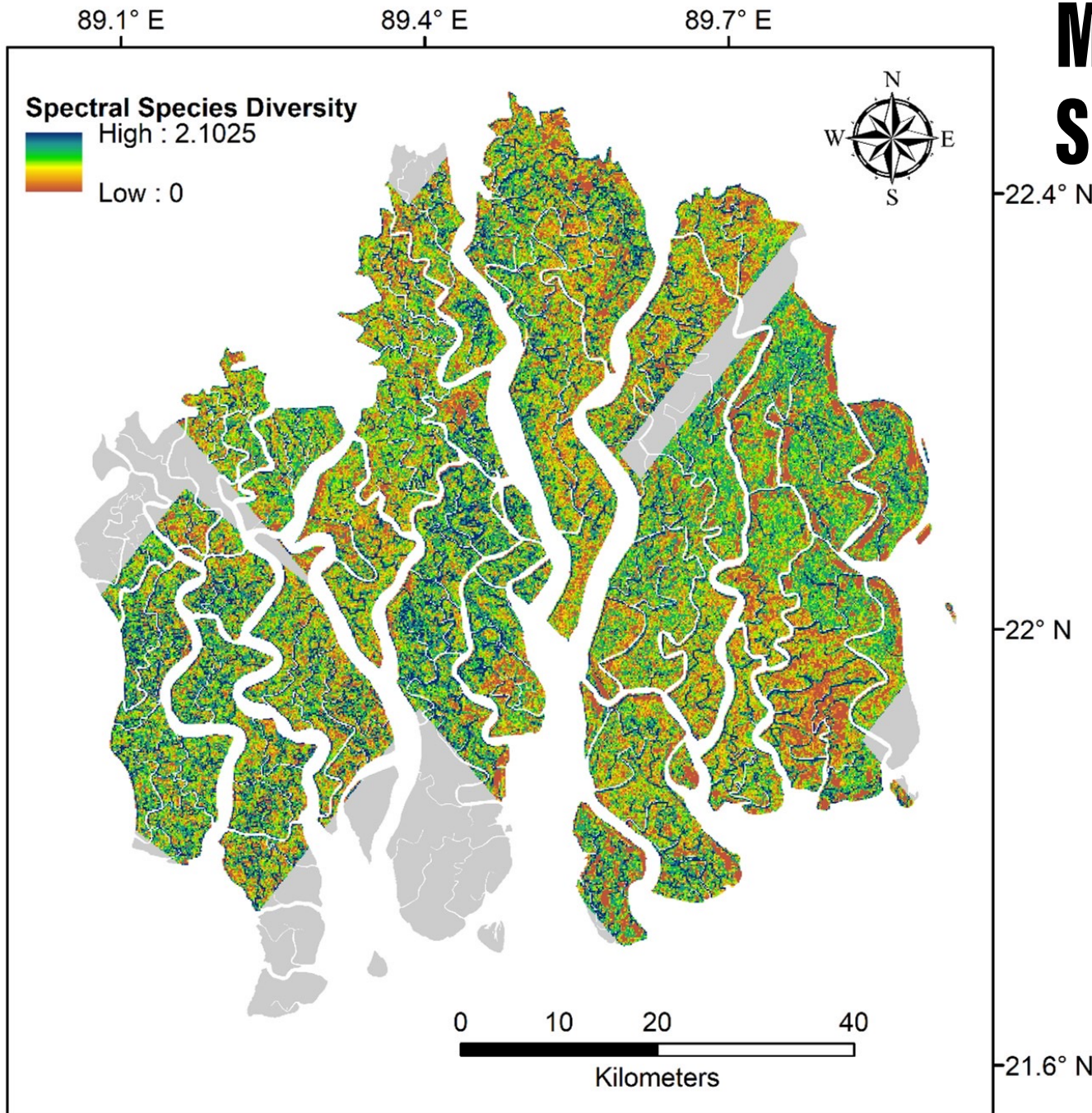
Hill numbers are designated as q



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# Mangroves of the Sundarbans Protected Area



Map of Spectral Species Diversity shows complex patterns across the mangroves with the greatest diversity in areas with the highest level of protection (wildlife sanctuaries)

Spectral Species Diversity does not follow a east to west gradient which was expected

# 2. BIRDNET RESULTS FOR BANGLADESH

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# Mangroves of the Sundarbans Protected Area

## West Zone - BirdNET Detections

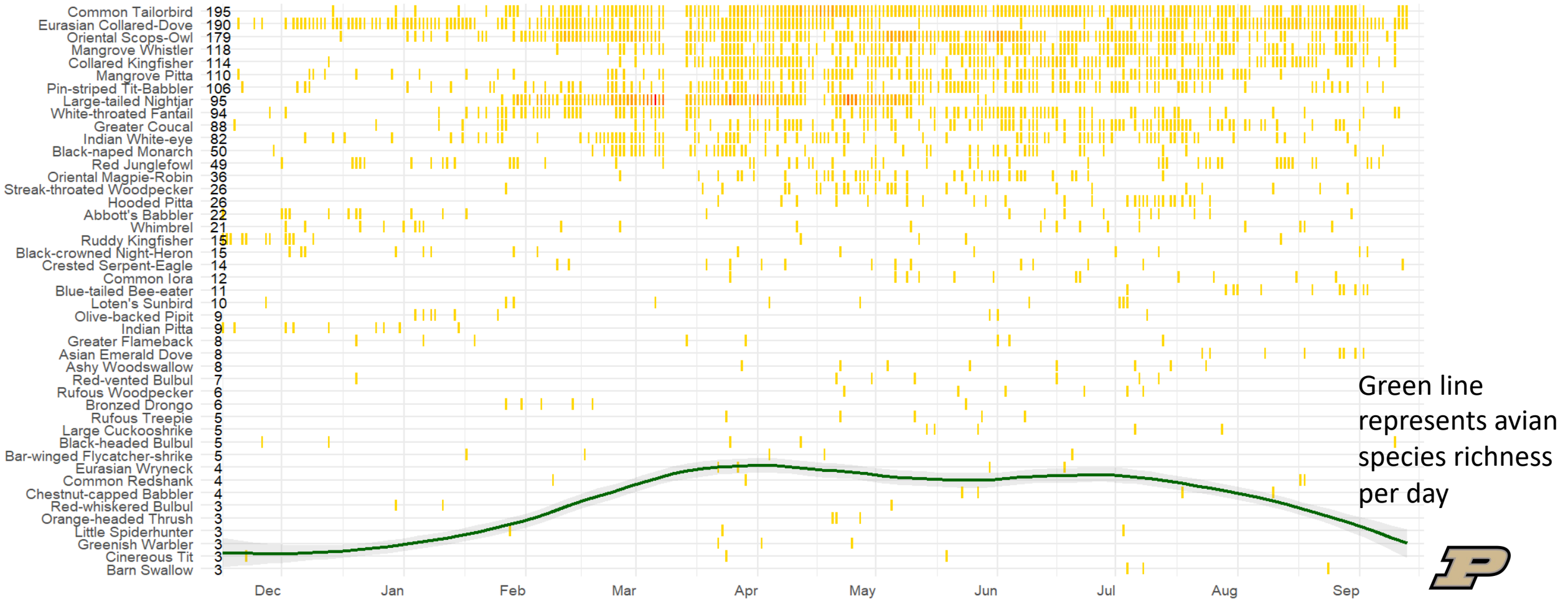


Fig 1: Temporal Trend in Avian diversity in West zone (high salinity) from November 2022 to September, 2023

# Mangroves of the Sundarbans Protected Area

## Central Zone - BirdNET Detections

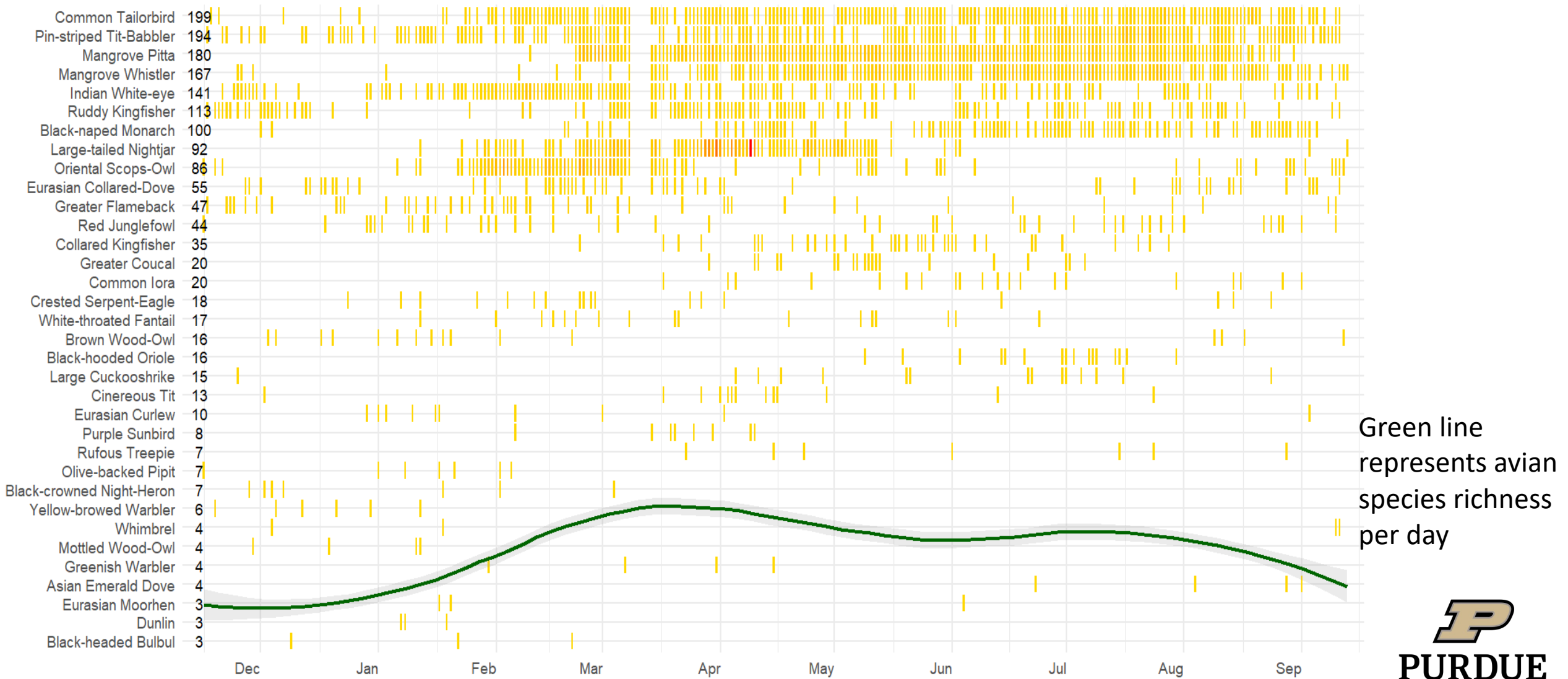


Fig 2. Temporal trends in avian diversity in central zone from November 2022 to September, 2023

# Mangroves of the Sundarbans Protected Area

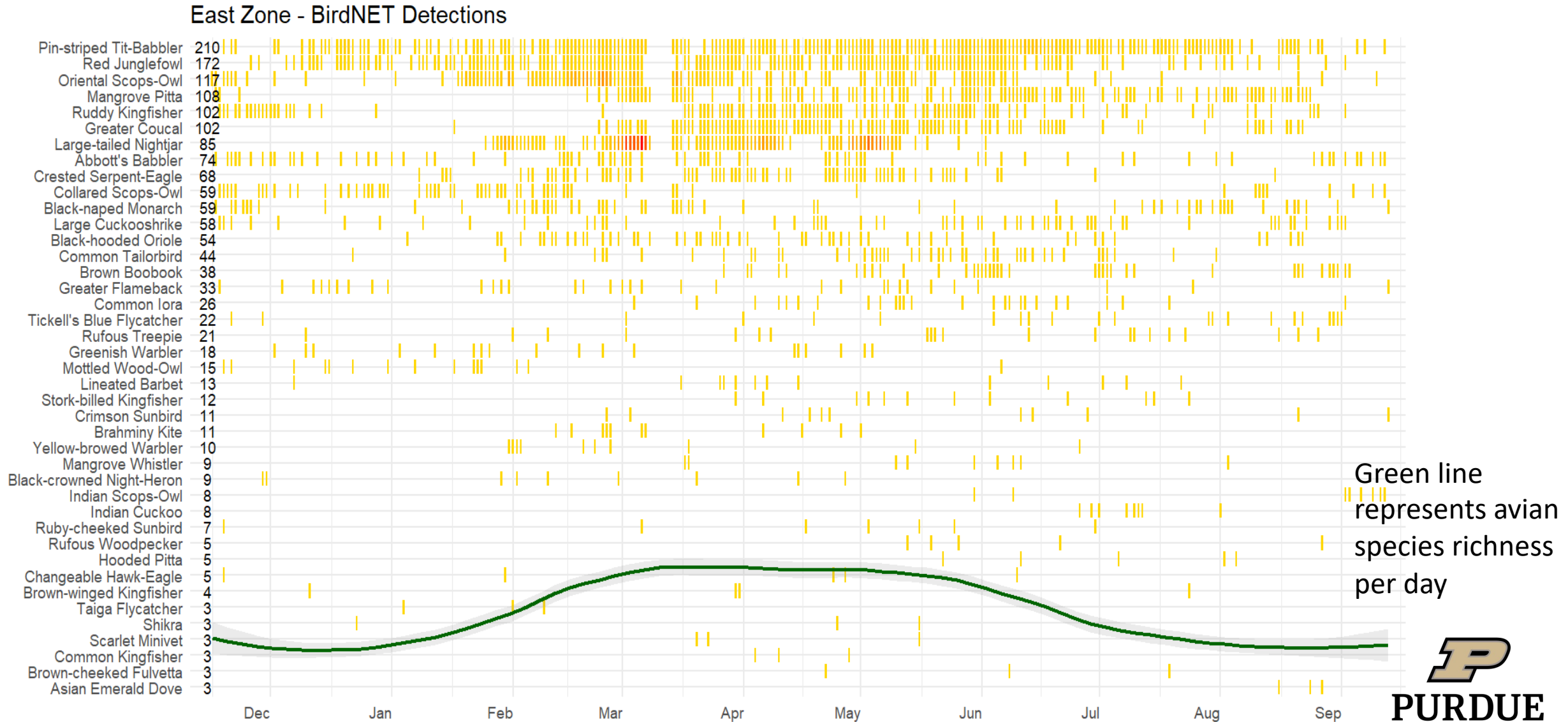
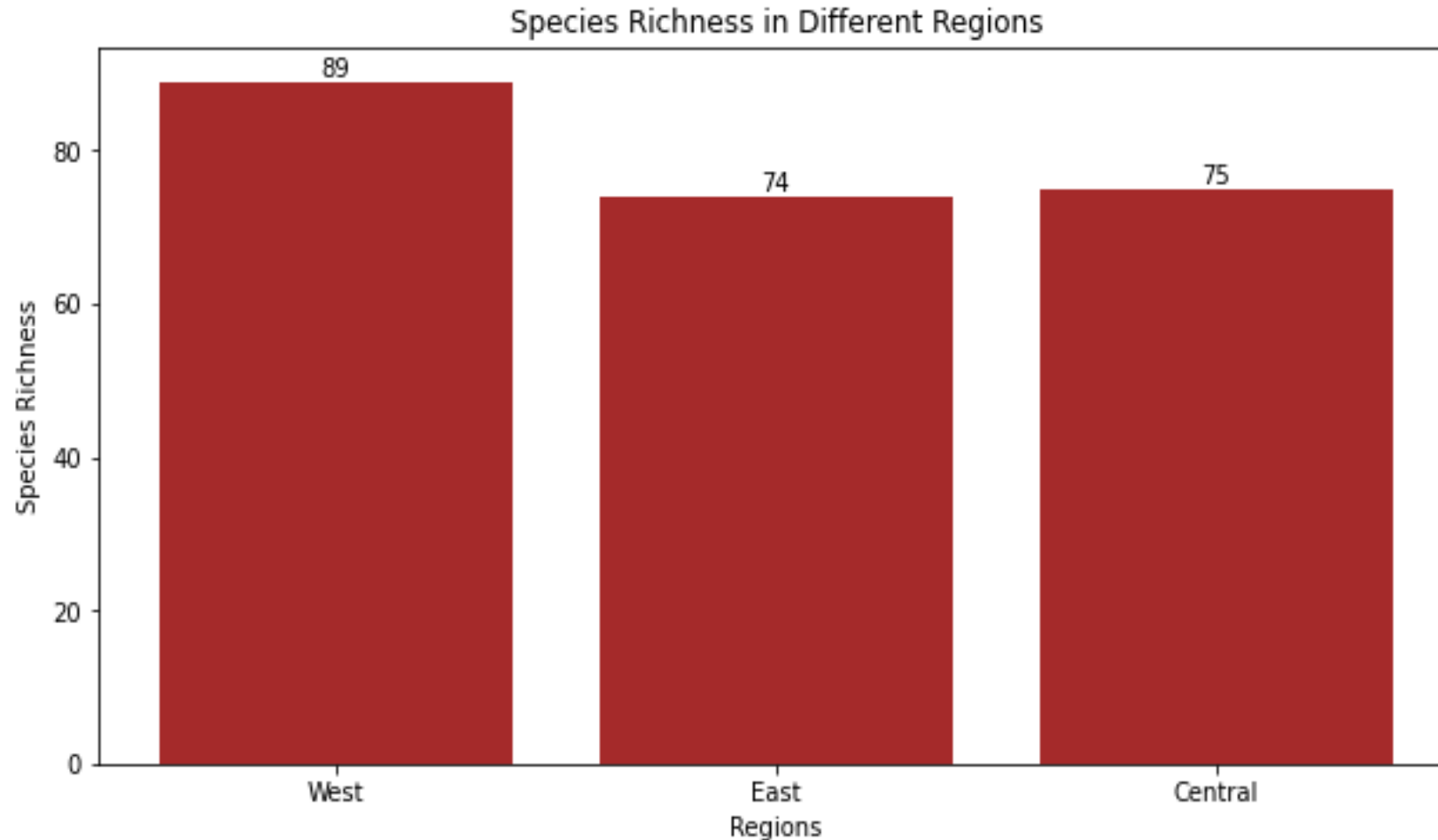


Fig 3 Temporal Trend in Avian diversity in East zone (low salinity) from November 2022 to September, 2023

# Mangroves of the Sundarbans Protected Area



Hypothesis 1.5 is that due to high stress in the west and high levels of top dying disease, bird species richness should be the lowest.

Preliminarily rejecting hypothesis

Fig 4: Species richness in salinity zones

# Mangroves of the Sundarbans Protected Area

## Common species between zones

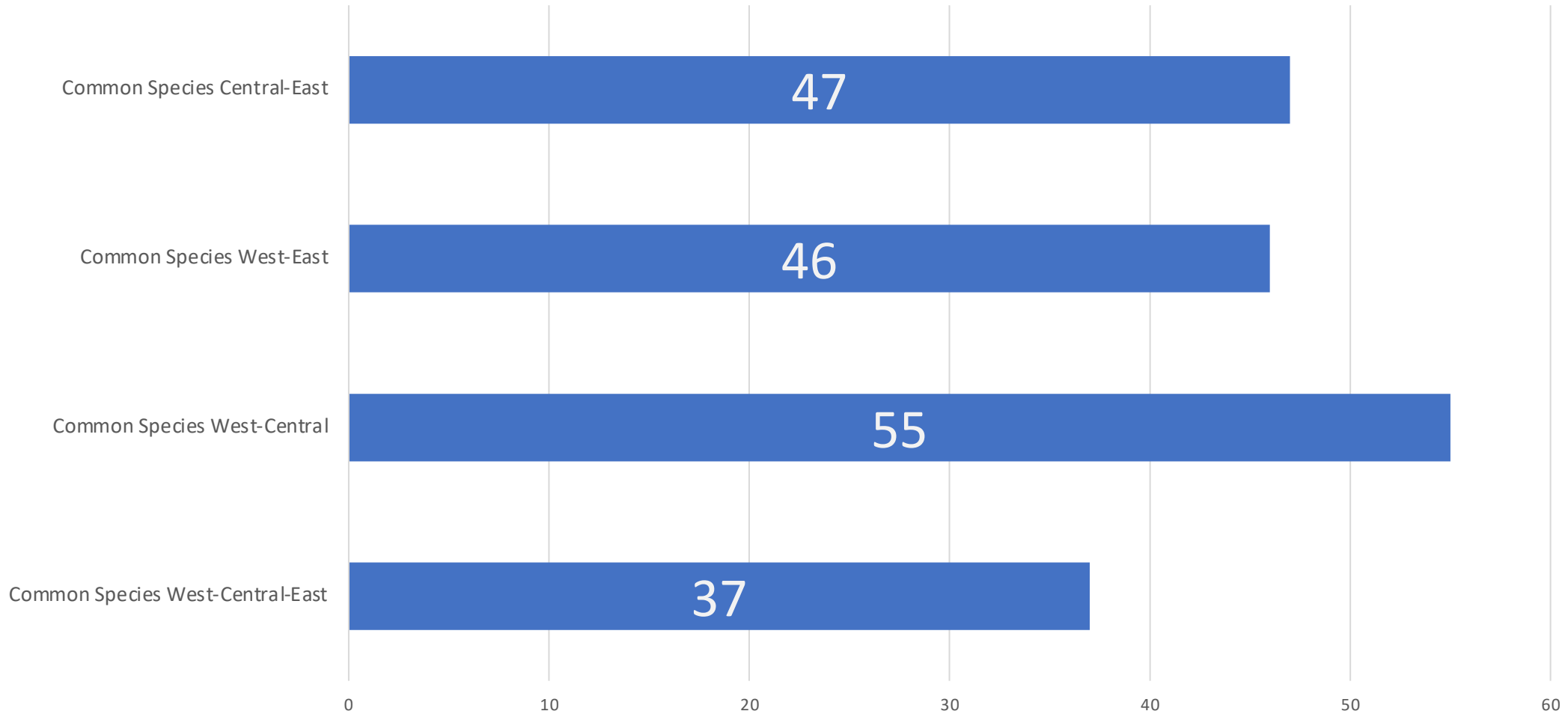


Fig 5: Number of common species between zones

# Mangroves of the Sundarbans Protected Area

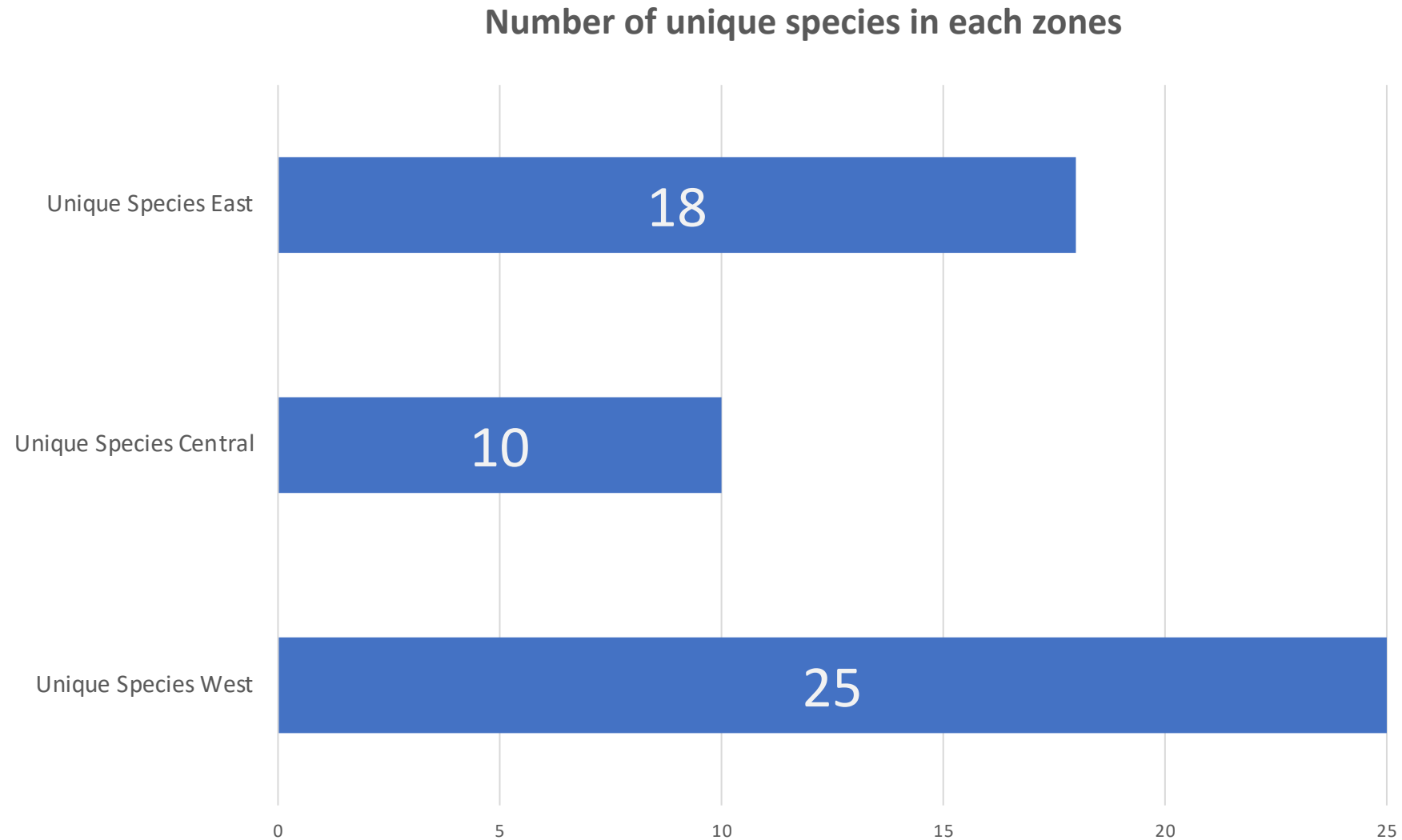


Fig 6: Number of unique species in each zone

# Mangroves of the Sundarbans Protected Area

## Numbers of migratory species in each zone

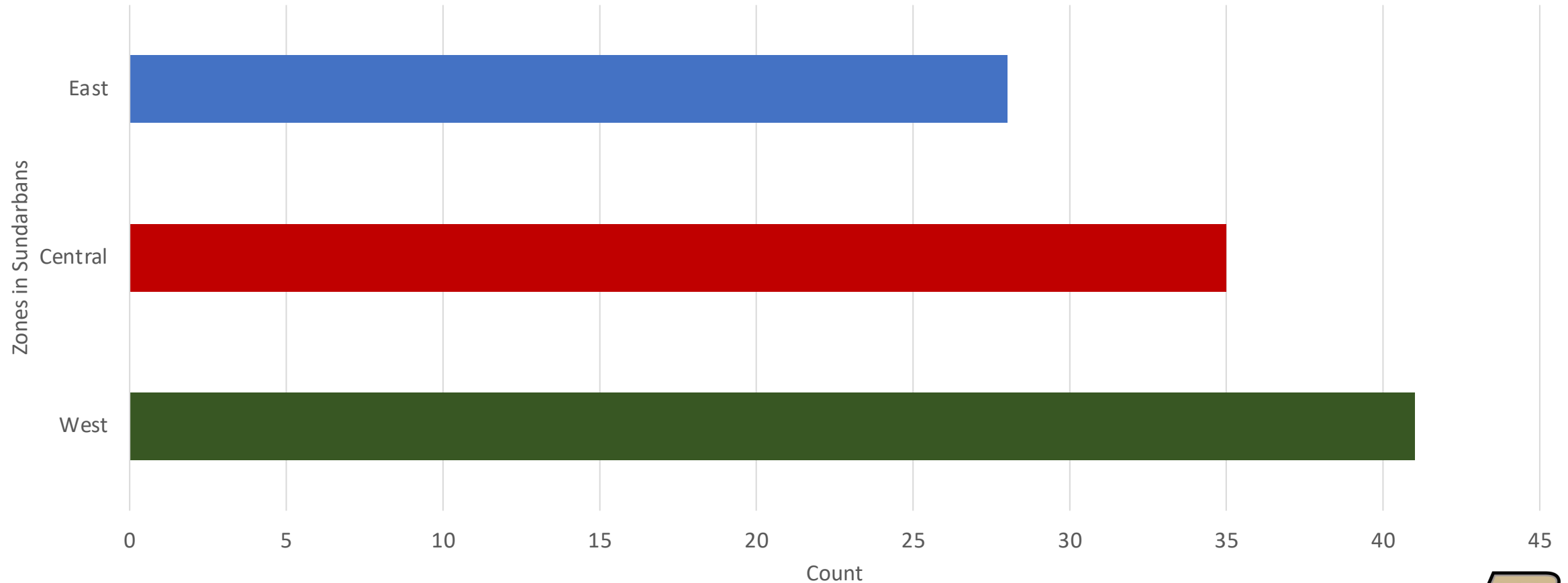


Fig 6: Number of Migratory species in each zone

# Mangroves of the Sundarbans Protected Area

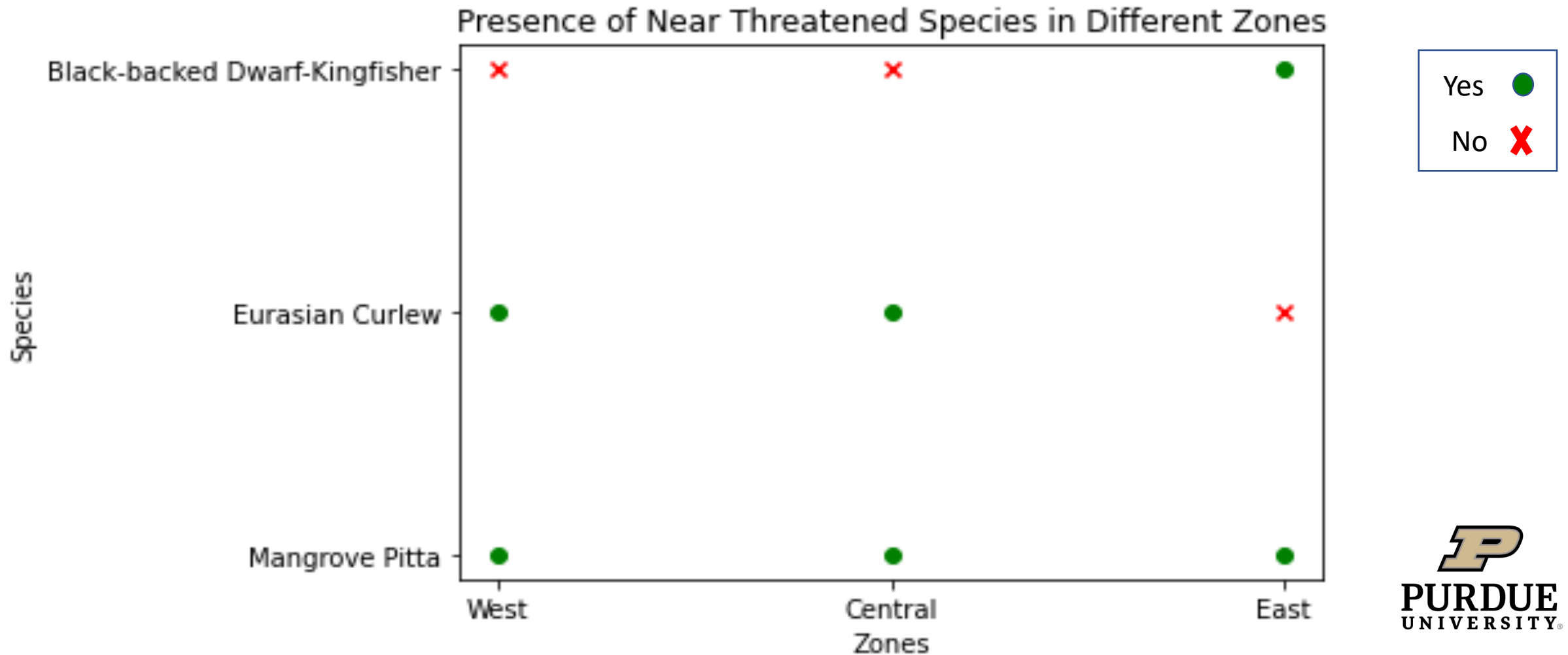
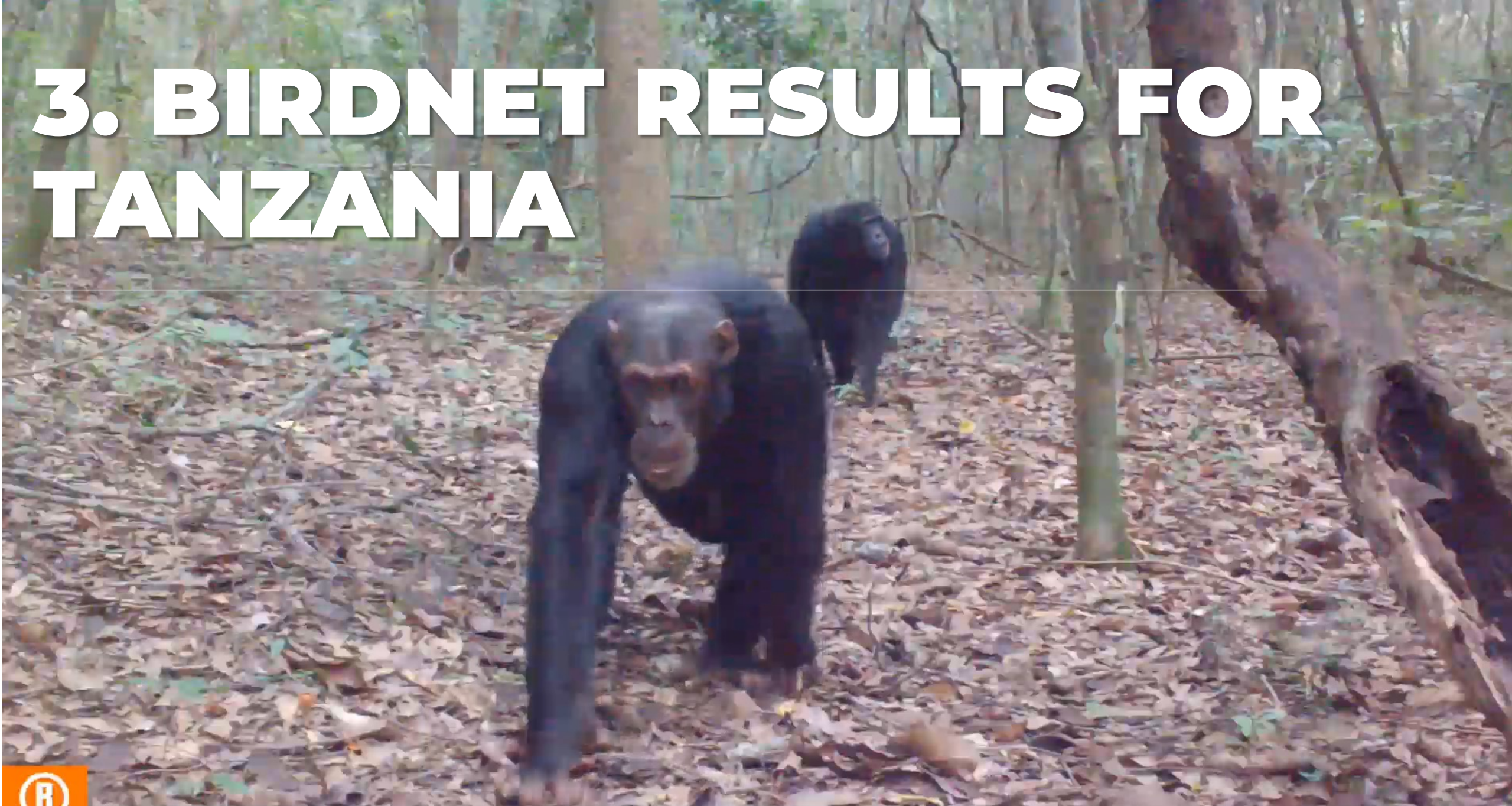


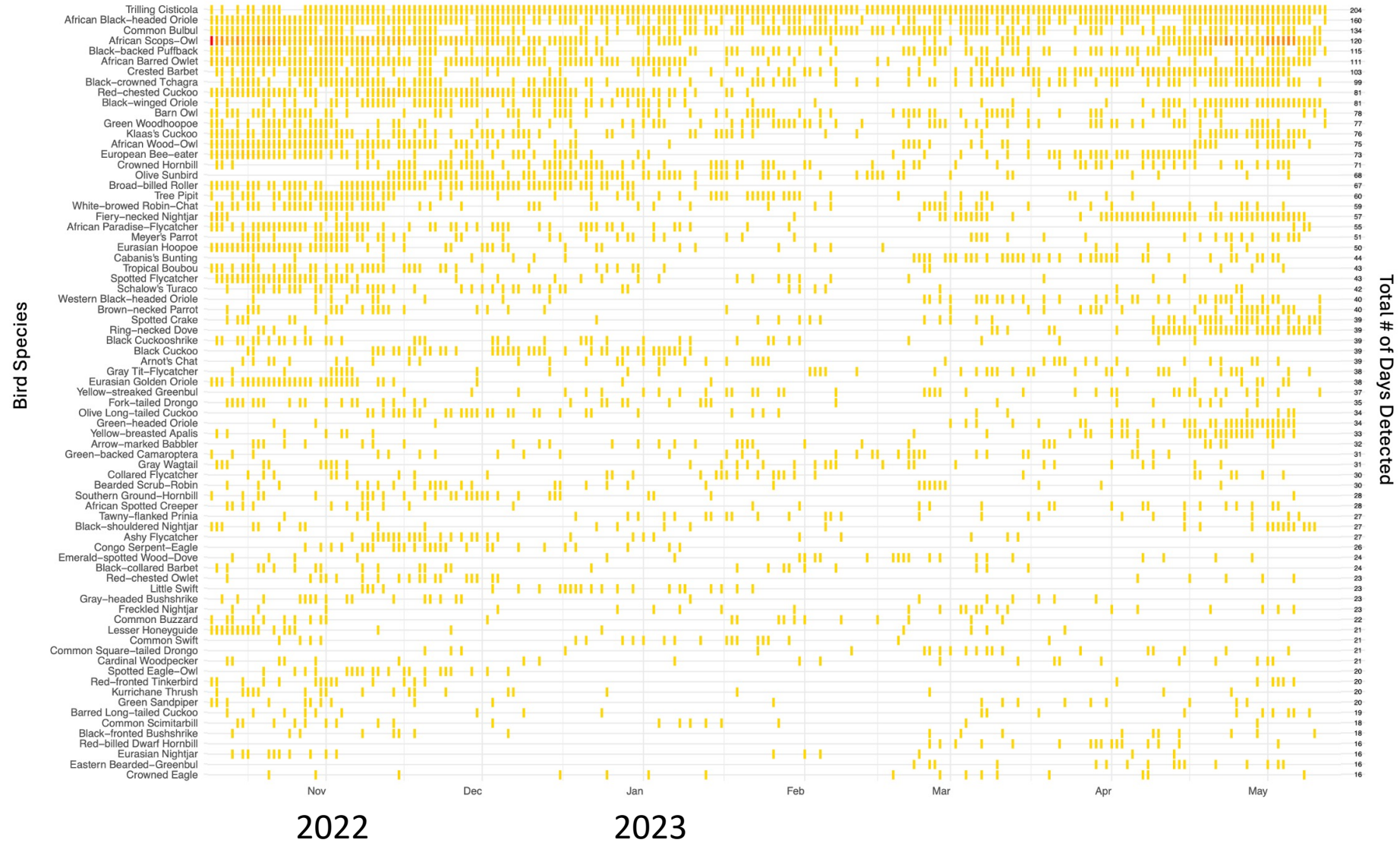
Fig 7: Near Threatened species according to IUCN in each zones



# 3. BIRDNET RESULTS FOR TANZANIA



## Tanzania BirdNET Species Detections (8 ARUs)



# Preliminary Analysis of Acoustic Data from Tanzania and Plant Survey Results

Daily call rate averages (per hour)

Over 120 species of birds detected during 7 months of recording

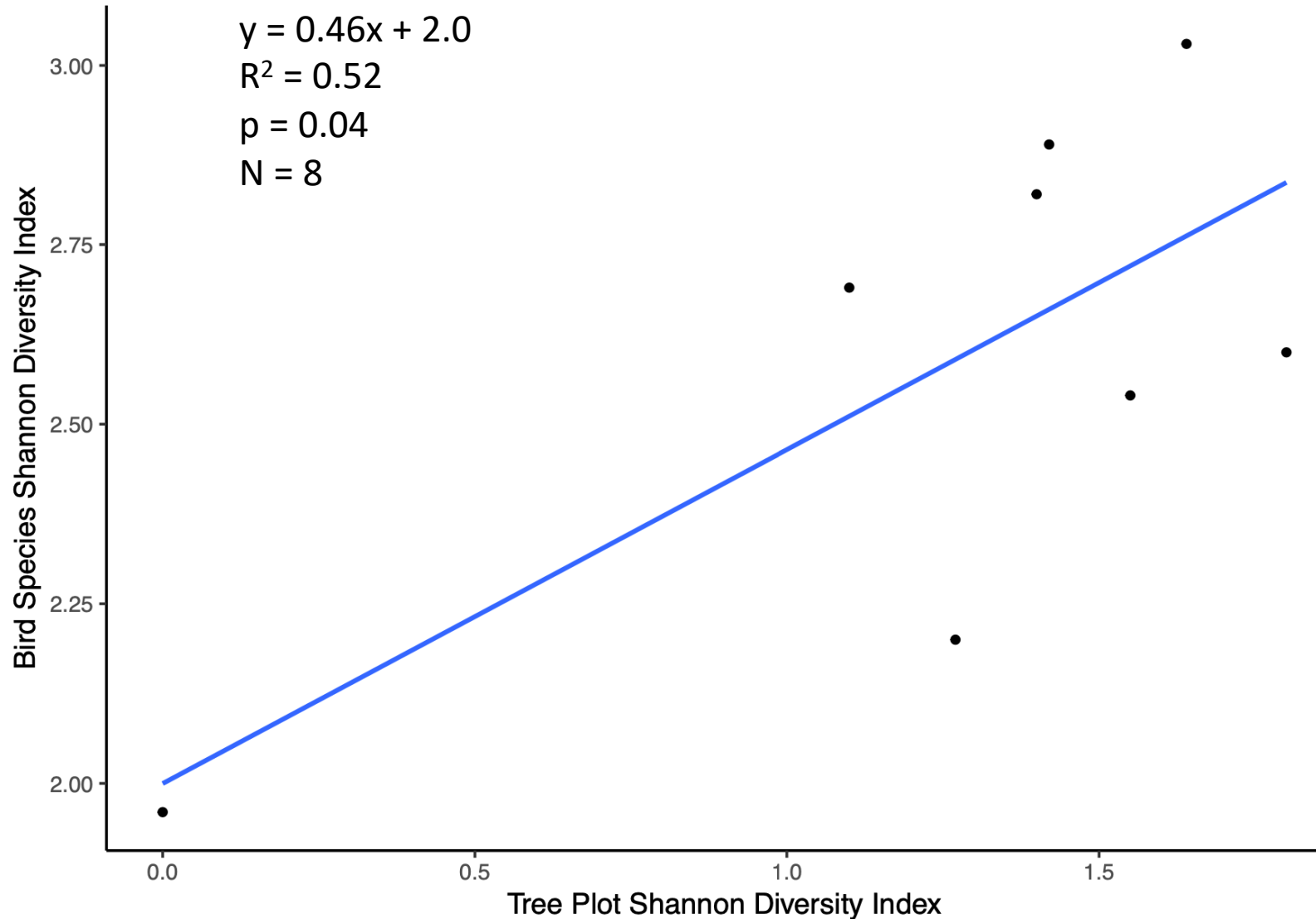


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# Tree Plot Shannon Diversity vs. BirdNET Species Shannon Diversity

(Preliminary Results for 8 ARUs)



Hypothesis 1.6 is that avian species call rate diversity should be positively correlated with plant species diversity

Cannot reject

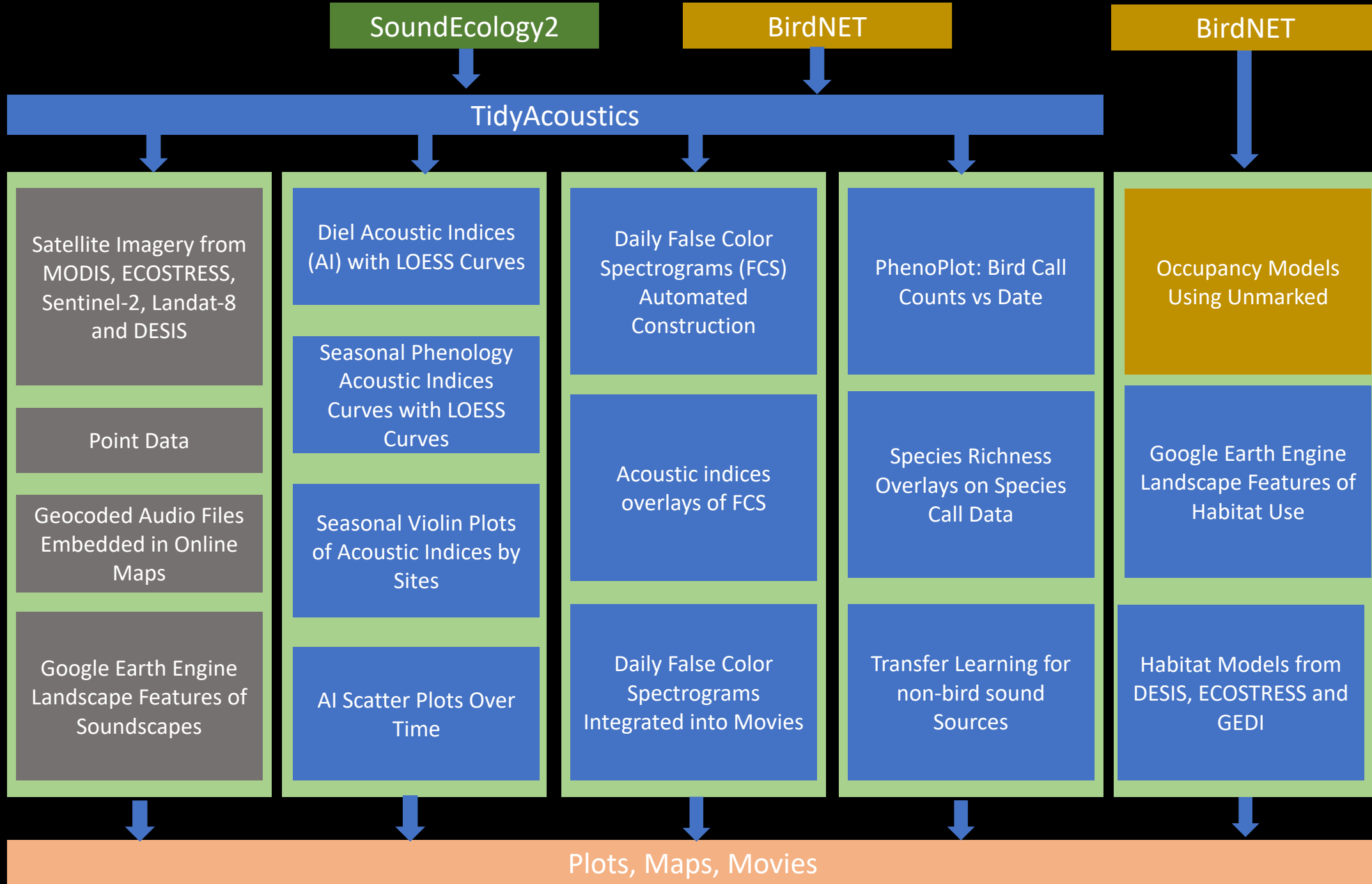
Bird Species Shannon Diversity = species richness times detection number (as proxy for abundance)

# 4. TECHNOLOGY DEVELOPMENTS



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- Purdue Custom Tools via A.7
- Off the Shelf Community Tools
- Historic Purdue Custom Tools
- Geospatial Data

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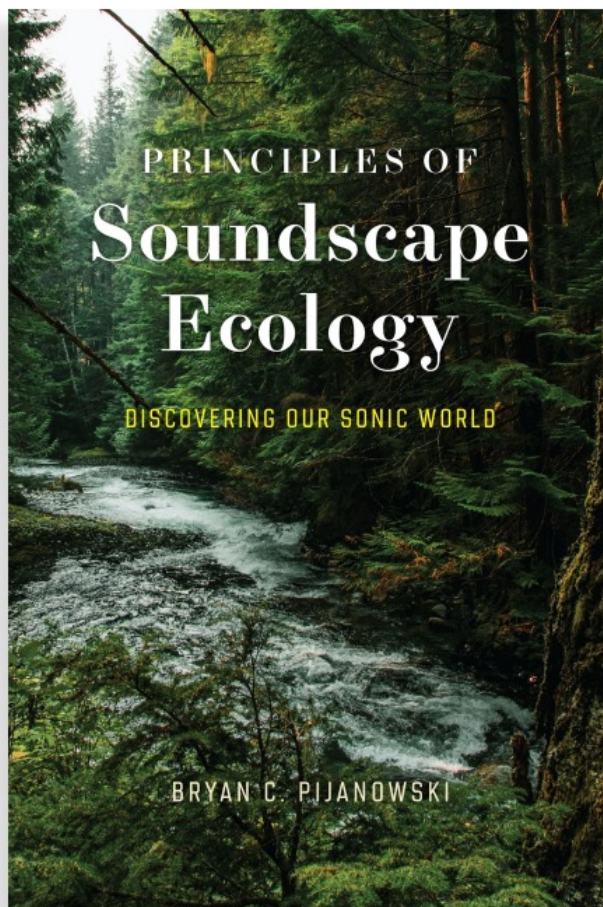
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# Principles of Soundscape Ecology

Discovering Our Sonic World

[Bryan C. Pijanowski](#)

From a founding figure in the field, the definitive introduction to an exciting new science.

What do the sounds of a chorus of tropical birds and frogs, a clap of thunder, and a cacophony of urban traffic have in common? They are all components of a soundscape, acoustic environments that have been identified by scientists as a combination of the biophony, geophony, and anthrophony, respectively, of all of Earth's sound sources. As sound is a ubiquitous occurrence in nature, it is actively sensed by most animals and is an important way for them to understand how their environment is changing. For humans, environmental sound is a major factor in creating a psychological sense of place, and many forms of sonic expression by people embed knowledge and culture. In this book, soundscape ecology pioneer Bryan C. Pijanowski presents the definitive text for both students and practitioners who are seeking to engage with this thrilling new field. *Principles of Soundscape Ecology* clearly outlines soundscape ecology's critical foundations, key concepts, methods, and applications.

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