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INFLUENCE OF LAND SURFACE TEMPERATURE AND VEGETATION COVER ON BIRD COMMUNITIES IN THE URBAN LANDSCAPE OF YOGYAKARTA

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Abstract

Urbanisation alters ecological processes and reshapes biodiversity patterns, with significant implications for bird communities. This study examined avian community structure across an urban gradient in Daerah Istimewa Yogyakarta, Indonesia, by integrating field surveys with remotely sensed environmental variables. Bird species richness and composition were assessed at 300 observation points stratified by urbanisation class. Environmental predictors, including vegetation cover and land surface temperature, were derived from Landsat 8 imagery. A Generalized Linear Mixed Model (GLMM) was used to identify key environmental drivers, accounting for spatial clustering within 2×2 km grids. Model selection via backward stepwise elimination revealed that bird species richness was positively associated with vegetation cover and negatively influenced by surface temperature. These results highlight the ecological importance of vegetation in urban landscapes and the adverse impacts of urban heat on biodiversity. Enhancing green infrastructure and maintaining vegetation cover are essential strategies to support avian diversity in rapidly urbanising regions.

Keywords: Bird community structure, Generalized Linear Mixed Model, urban biodiversity

Introduction

The shrinking of natural areas (e.g., forests and wetlands) is increasingly positioning cities as providing opportunities for biodiversity conservation (Angel *et al.* 2011, Aronson *et al.* 2017). This trend encourages various stakeholders to adapt urban environments, creating suitable habitats that support the coexistence of diverse species with humans

(Smith *et al.* 2018). Birds, due to their high mobility, are commonly observed among urban wildlife (Pennington & Blair 2012, Isaksson 2018). For instance, species able to withstand high-stress conditions but facing global decline, such as the Java sparrow (Mardiastuti *et al.* 2020), offer promising potential for wildlife conservation within urbanized ecosystems. Petersen *et al.* (2022) demonstrated that changes

in land cover due to urbanisation do not alter bird species composition but rather shift the prevalence of certain functional groups based on habitat conditions. Additionally, a study conducted by Jernakoff *et al.* (2023) in tropical regions demonstrated that functional diversity in birds is influenced by the complexity of existing vegetation structure. The loss of vegetation structural complexity, or in other words, the decline in habitat quality, can lead to changes in bird species composition (Clergeau *et al.* 1998, Evans *et al.* 2009). For example, suboptimal habitat quality in urban areas displaces specialist bird species that rely on the presence of certain vegetation to support their survival (Fernández-Juricic 2004). These findings underscore the role of habitat quality in shaping bird communities; however, this does not diminish conservation concerns, as human-induced disturbances within urban areas still influence the survival of bird communities (Chace & Walsh 2006). Additional research by Pauw and Low (2012) highlights that urbanisation can affect specific functional groups, leading to the loss of species with critical ecological roles. These findings should be addressed with site-specific ecological evidence.

The expansion of built-up areas resulting from urbanisation frequently leads to a decline in environmental quality (Congedo & Macchi 2015). This demand for development leaves limited space for ecological regulators within urban areas (Gu *et al.* 2016, Teimouri *et al.* 2023). Urban areas typically have a lower proportion of vegetation cover compared to other land cover types. However, vegetation plays a crucial role as an ecological regulator in urban settings, offering a range of ecosystem services. One of its key functions is climate regulation (Ferrini *et al.* 2020, Rózová *et al.* 2020, Sandoval *et al.* 2024).

In an ecological context, vegetation within an urbanized ecosystem is essential for supporting bird communities. Beyond meeting basic wildlife needs, vegetation provides foraging resources and acts as a buffer against high temperatures. Urban landscapes often generate higher temperatures than surrounding areas (urban heat island effect/UHI) due to the prevalence of built-up areas relative to vegetation cover (Weng 2011, Vujovic *et al.* 2021). However, previous research has shown that incorporating vegetation into urban landscapes can significantly mitigate UHI effects (Susca *et al.* 2011, Rushayati *et al.* 2018, Zhao *et al.* 2020). This mitigation not only improves thermal comfort for humans and

wildlife but also reduces energy demand for cooling (Akbari *et al.* 2001, Solecki *et al.* 2005, Cai *et al.* 2023).

Birds are among the species highly sensitive to temperature (Jimenez & Williams 2014, Andreasson *et al.* 2020, Pattinson *et al.* 2020). Elevated environmental temperatures restrict the activity range of birds due to thermoregulatory limitations (du Plessis *et al.* 2012, Freeman *et al.* 2020). Under high-temperature conditions, birds often display heat-dissipation behaviours, such as panting and seeking shade (du Plessis *et al.* 2012, Silva *et al.* 2015). However, these behaviours carry negative consequences, reducing feeding efficiency and potentially leading to the loss of body mass due to increased metabolic rates (Pis 2010, du Plessis *et al.* 2012). In tropical regions, high temperatures can have even more pronounced impacts; for example, in Costa Rica, increased mortality was observed among the rufous-and-white wren (*Thryophilus rufalbus*) during the dry season (Woodworth *et al.* 2018). High temperatures in tropical areas can also drive bird species to shift their distribution to cooler regions (Forero-Medina *et al.* 2011). Conversely, some studies have found that tropical bird species exhibit greater adaptability to elevated temperatures (Weathers 1997, Wiersma *et al.* 2007, Londoño *et al.* 2015, Noakes *et al.* 2016). Despite these physiological adaptations to temperature variation, tropical birds still have upper thermal tolerances that can be exceeded by increased urban temperatures, rendering them vulnerable to temperature increases, which can compromise their fitness and survival (Monge *et al.* 2023). Londoño *et al.* (2015) highlighted, through their findings on the efficient metabolism of tropical birds in relation to environmental temperature, the necessity for further ecological investigation into the relationship between temperature and avian species survival. Woodworth *et al.* (2018) also observed that while some species can adapt to high-temperature conditions, others remain highly susceptible.

The decline of bird species in a particular location can have adverse effects on the ecosystem. Birds function as environmental bioindicators and perform key ecosystem roles, such as pollination, especially important in fragmented vegetation within areas subject to stochastic disturbances, like urban environments (Gregory *et al.* 2003, Szlavecz *et al.* 2011, Mekonen 2017, Estevo *et al.* 2017, Xu *et al.* 2018, Fraixedas *et al.* 2020). Moreover, the

characteristics of urban landscapes, which are dominated by built-up areas with minimal vegetation cover, can influence bird community assemblages due to the scarcity of high-quality habitats (Manhães & Loures-Ribeiro 2005, Leveau 2021, Wang *et al.* 2023, Suarez-Castro *et al.* 2024). This issue is not only associated with habitat availability but also with changes in macroclimatic conditions, particularly the increase in surface temperatures, which are higher compared to vegetated areas (Buyadi *et al.* 2014, Lima Alves and Lopes 2017, Gherri 2023, Yaşlı *et al.* 2023). Such conditions can undoubtedly restrict the presence of certain species that are sensitive to high temperatures, leading urban bird communities to be predominantly composed of generalist species that can adapt to more extreme environmental pressures.

Daerah Istimewa Yogyakarta (DIY) is a region in Indonesia experiencing significant climatic and spatial environmental changes. Climatically, 60% of DIY has become drier (Wredaningrum & Sudibyakto 2014), with air temperatures rising over the past three decades (Wuragil 2021). A study by Wacano *et al.* (2021) demonstrated that urban areas in DIY are particularly vulnerable to climate change. In terms of landscape configuration, spatial transformations are marked by the conversion of agricultural land to non-agricultural uses (e.g., housing, settlement, and built-up area) on the periphery of DIY's urban areas, driven by population shifts from urban centres to suburban areas (Selang *et al.* 2018, Rozano & Yan 2018). In urban areas, agricultural land is considered a valuable habitat due to the surrounding environment being predominantly built-up. This land conversion has led to a reduction in green open spaces within DIY's urban areas (Widiyastuti *et al.* 2020), despite the critical ecological role green spaces play in supporting wildlife communities (Prihandi & Nurvianto 2022, Hadi *et al.* 2024, Oropeza-Sánchez *et al.* 2025).

Previous research has investigated the dynamics of bird communities within DIY's urban landscapes. Prihandi & Nurvianto (2022) found that vegetation within green open spaces enhances bird diversity in DIY. Other studies corroborate these findings, with evidence showing that vegetation, particularly understory cover, supports greater species abundance and richness compared to areas with sparse vegetation (Utama & Nurvianto 2022).

Additionally, research by Pudyatmoko *et al.* (2009) indicated that DIY's urban landscape offers better opportunities for bird conservation compared to forested areas and agroforestry. Suropto *et al.* (2020) also demonstrated that vegetation on various university campuses in DIY not only contributes to campus aesthetics but also supports bird communities. However, previous research has not incorporated temperature as a climatic variable, which can influence the success of bird conservation efforts in hot urban tropical regions like DIY. Consequently, this study aims to explain bird community responses to environmental factors in DIY's urban landscape, now subject to climatic (land surface temperature/LST) and spatial pressures through the lack of vegetation in areas with dominant anthropogenic factors. To address these aims, non-parametric statistical analysis will be used. The study thus poses the following research questions: (1) What is the structure of bird communities within DIY's urban landscape? (2) Does bird diversity respond to LST and vegetation cover in DIY's urban landscape?

Materials and methods

Study region. This study was conducted in the urban areas of DIY and its surroundings in July 2023. DIY, a province in Indonesia, is located in the central region of Java Island. Geographically, DIY lies between 7°33'-8°12' South Latitude and 110°00'-110°50' East Longitude. Administratively, DIY comprises five regencies: Sleman, Kulon Progo, Bantul, Gunung Kidul, and Kota Yogyakarta. According to data obtained from BMKG (2025), the daily temperature in DIY in 2023 ranged from 18.2 to 35.6 °C. The annual precipitation in DIY in 2023 ranged from 1 to 671 mm (BPSPDIY 2024). Given its status as the provincial capital and the most densely populated area in DIY, the research primarily focused on Kota Yogyakarta and its surrounding areas (BPSPDIY 2022).

Site Characterization. The placement of observation points was designed based on land classification using Supervised Classification. The results of this classification were used to define urban classes, as proposed by Marzluff *et al.* (2001), specifically according to the percentage of built-up areas: non-urbanized area (rural) (5-20% built up), suburban (30-50%), and urban (>50%). Land classification was conducted using the Semi-Automatic Classification Plugin in Quantum GIS (QGIS) software (QGIS 2009, Congedo 2021, UNOOSA 2025).

Landsat 8 OLI/TIRS imagery with 30m pixels was used to perform supervised classification. The overall accuracy of the classification results was 0.76, with ESA WorldCover as the reference raster (Zanaga *et al.* 2021). Accuracy assessment was conducted in R Studio using a confusion matrix approach (Günlü *et al.* 2009, Sari *et al.* 2021). The ESA WorldCover dataset was reclassified to match the land cover classes used in this study, and stratified random sampling was applied to generate 100 validation points across all classified land cover types (Olofsson *et al.* 2014). Classification values were extracted from both the supervised classification output and the reference dataset at the sampled locations. A confusion matrix was then constructed to evaluate classification performance, and accuracy metrics were calculated.

The results of the land classification were further used to stratify urbanization classes based on the percentage of built-up areas following Marzluff *et al.* (2001). A 2×2 km grid was randomly placed, and each grid cell was categorized according to the proportion of built-up area within it. This approach ensured that urbanization classes were assigned systematically while maintaining consistency with the classification criteria. The 2×2 km grid size was selected because the settlement classification by Marzluff *et al.* (2001) is most effective for areas of at least 1 km².

Environmental factors characterising the study site were generated using a macro approach (Morin 2011). Landsat 8 OLI/TIRS imagery served as the primary data source for identifying environmental characteristics. The Landsat 8 imagery, acquired in July-August 2023, was selected for its temporal alignment with the field survey, ensuring consistency between remote sensing data and ground observations of bird communities. These factors included the Normalized Difference Vegetation Index (NDVI), Normalized Difference Built-up Index (NDBI), Normalized Difference Water Index (NDWI), and Land Surface Temperature (LST). Processing of Landsat 8 OLI/TIRS imagery to derive these environmental characteristics was conducted using the Google Earth Engine (GEE) cloud platform (Gorelick *et al.* 2017) and QGIS software.

Bird survey. The bird community survey was conducted throughout July 2023, during both morning (05:30–10:00 a.m.) and afternoon (03:00–5:30 p.m.) periods. Each of the 2 × 2 km grids was subsequently divided into sub-grids of

400 × 400 meters, which represent an effective spatial scale for landbird surveys (Knutson *et al.* 2016). The survey method followed the approach recommended by Bibby *et al.* (1992), employing a 50 m radius circular plot at each observation point, with a 10-minute observation period. A total of 300 observation points (Fig. 1) were utilised, with 100 points assigned to each urban class.

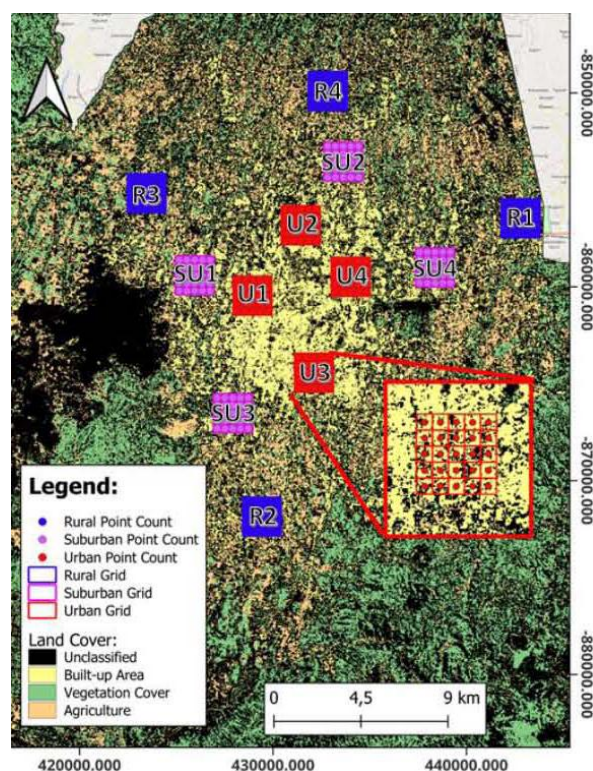


Figure 1. The study site in Yogyakarta, Central Java. Observation points were distributed across twelve 2 × 2 km grids classified into three urbanization levels: Rural (R), Suburban (SU), and Urban (U), as shown in the map. Grids were selected using a combination of stratified and systematic random sampling. Within each grid, observation points were spaced 400 meters apart, resulting in a total of 300-point counts equally divided among the three urbanization classes. The map displays the grid locations, point count distributions, and land cover types used to support classification and analysis.

Data analysis. The analysis of bird community structure commenced with describing species diversity within each urban class using the Shannon-Wiener Index, chosen for its relatively low standard error (Magurran 2004, Gaur *et al.* 2020, Novriyanti *et al.* 2021, Saka *et al.* 2022, Xu *et al.* 2022, Hadinoto *et al.* 2023, Mahata & Sharma 2023). The Shannon-Wiener Index was also selected for its effectiveness in measuring species diversity in biological

communities with a few dominant species, as is typical in urban ecosystems (Szlavec *et al.* 2011, Yeom & Kim 2011, Isaksson 2018). In addition to diversity, species dominance and abundance distribution within each urban class were illustrated using a Whittaker Rank-Abundance Plot (Magurran 2004, Ulrich *et al.* 2010). Bird abundance data were log₁₀-transformed to aid interpretation (Magurran 2004, Ortega-Álvarez & MacGregor-Fors 2009). Further to community structure, a descriptive analysis of the mean body size of bird species within each urban class was conducted to identify any class-specific patterns. Bird species body size references were derived from literature on Indonesian bird species (MacKinnon *et al.* 2010, Eaton *et al.* 2016, Taufiqurrahman *et al.* 2022). The R Studio packages used for this analysis included Stats (R Core Team 2024) and ggplot2 (Wickham 2016).

Bird community structure was further analysed through clustering and comparison of bird species differences across urban classes. Bird species clustering or distribution was assessed using Bray-Curtis Similarity in PAST software (Hammer *et al.* 2001, Ortega-Álvarez & MacGregor-Fors 2009, Kaban *et al.* 2018, Leveau *et al.* 2018, Titoko *et al.* 2019). Comparison of bird species across urban classes was conducted using the Kruskal-Wallis test, with pairwise Wilcoxon tests as post hoc analyses (Tassicker *et al.* 2006, Abilhoa & Amorin 2017, Dröge *et al.* 2021). These analyses were performed in RStudio using the Stats package (R Core Team 2024).

To address potential non-independence among observations within the same 2 × 2 km grid, a Generalized Linear Mixed Model (GLMM) with a Poisson distribution was fitted, incorporating grid code as a random effect, as the response variable—bird species richness—represents count data (Zuur *et al.* 2010, St-Pierre *et al.* 2018). Environmental predictors, including NDVI, LST, NDWI, and NDBI, were selected based on their well-established role in explaining wildlife distribution and diversity (Nieto *et al.* 2015, Marasinghe *et al.* 2015, Ikhumhen *et al.* 2020, Azeem *et al.* 2021, Teng *et al.* 2021, Rahman *et al.* 2022, Kontsiotis *et al.* 2023, Zhai *et al.* 2024), particularly in relation to climatic and spatial variation. All continuous predictors were standardised (mean = 0, SD = 1) prior to modelling to enhance convergence and comparability of effect sizes. A backward stepwise elimination approach was applied to

derive the minimal adequate model by removing non-significant predictors (Crawley 2013). While the final model was constructed using standardised values, predicted values were back-transformed to the original scale to facilitate interpretation in visualisations, which were produced using ggplot2 (Wickham 2016), ggthemes (Wilke 2022), hrbrthemes (Rudis 2020), ggpubr (Kassambara 2023), and viridis (Garnier *et al.* 2021).

Results

Community structure. A total of 45 bird species were recorded during the survey. These were wild perching birds, not domesticated pets from the local community. According to the International Union for Conservation of Nature (IUCN), most recorded species were of relatively low conservation concern (Sup. Table 1). Additionally, the species recorded were primarily synanthropic (Mardiastuti *et al.* 2020). Synanthropic species are those that have adapted to anthropogenic conditions, while synurbic species are associated with urbanised environments (Luniak 2004, Francis & Chadwick 2012). The three species with the highest densities, from most to least abundant, were the Javan Munia (*Lonchura leucogastroides*), Eurasian Tree Sparrow (*Passer montanus*), and Sooty-headed Bulbul (*Pycnonotus aurigaster*). Feeding guilds were determined by reviewing previous studies (MacKinnon *et al.* 2010, Azman *et al.* 2011, Rumblat *et al.* 2016, Mardiastuti *et al.* 2018, 2020, Muhammad *et al.* 2018, Shafie *et al.* 2023).

Based on Shannon-Wiener Index calculations, bird communities in rural areas showed higher diversity compared to those in suburban and urban areas (Sup. Table 2). This indicates that greater levels of urbanisation are associated with lower bird diversity. Additionally, species richness and bird abundance also varied across the different urban classes. The feeding guild classification of bird species at the study site included insectivorous, omnivorous, granivorous, carnivorous, and nectarivorous species (Fig. 2). Insectivorous species were dominant in each urban class (Fig. 3). The number of species in each feeding guild remained relatively stable across urban classes, except for omnivorous species, which increased in urban areas. The graph indicates that certain species were dominant in each class. The Javan Munia was the most frequently recorded bird species across all

urban classes. The Sooty-headed Bulbul (in rural and suburban areas) and the Eurasian Tree Sparrow (in urban areas) were also among the dominant species.

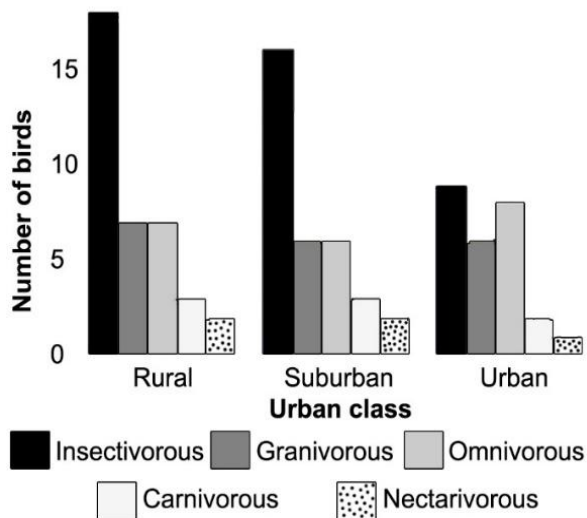


Figure 2. Composition of feeding guilds in bird communities across each urban class. Insectivorous species were the dominant feeding guild in each urban class, with the highest number found in rural areas.

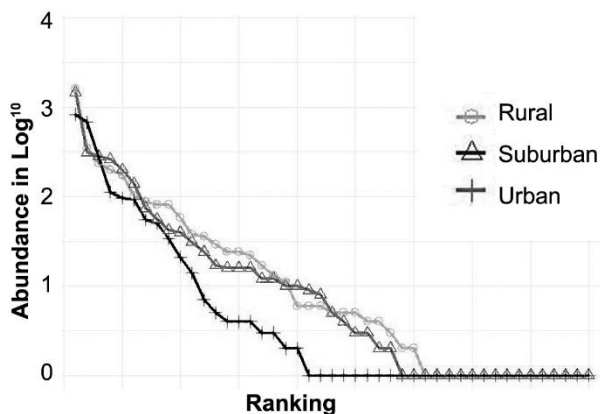


Figure 3. Bird abundance distribution in each urban class. This graph indicates that certain bird species were dominant in each urban class. The rural area shows a gradual decline, indicating greater species richness and evenness, while the urban area has a sharp drop-off, meaning a few bird species dominate while others have low abundance.

The bird communities in rural and suburban areas showed similar patterns, while the abundance distribution in urban bird communities was different compared to rural and suburban areas (Fig. 3). Steeper slopes (rapid drop in relative abundance) suggest low evenness, meaning a few bird species have much higher abundance than others. Flatter slopes (slower decline) indicate higher evenness, where

abundance is more evenly distributed across urban classes. The rural areas have a more extended and gradual decline, which suggests higher species richness and greater evenness. Urban has a sharp drop-off, which means fewer dominant plots hold most of the species, with others having very low abundance. This aligns with the Bray-Curtis Similarity analysis, which found that bird communities in suburban and rural areas were more alike based on bird species composition (Fig. 4). Although visually, bird communities in suburban and urban areas appeared similar, the Kruskal-Wallis comparison and Post hoc Pairwise Wilcoxon tests showed significant differences in bird communities' species richness across all urban classes, as indicated by the differences in bird species richness recorded at the study site (Fig. 5).

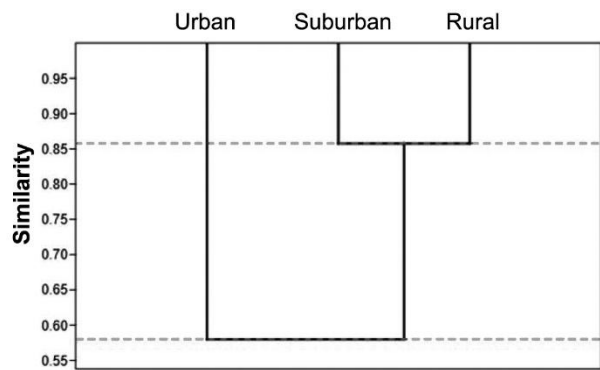


Figure 4. Bray-Curtis Similarity dendrogram of each urban class at the study site. The bird communities in suburban and rural areas tended to be similar (>85%, upper dashed line) compared to the bird communities in urban areas (<60%, lower dashed line).

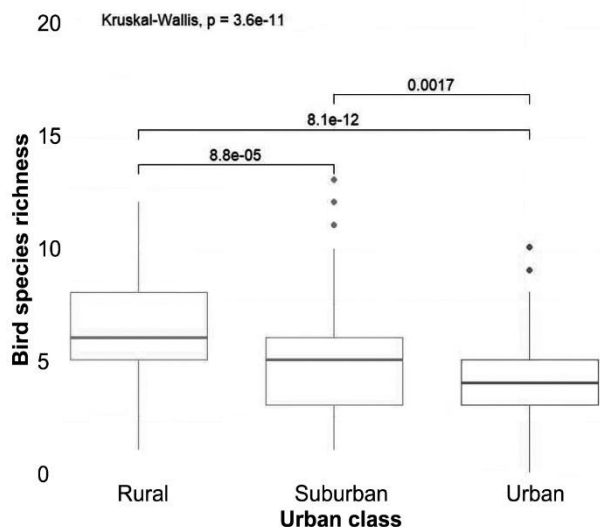


Figure 5. Comparison of bird species richness across each urban class. The differences in bird species richness in each urban class were significant.

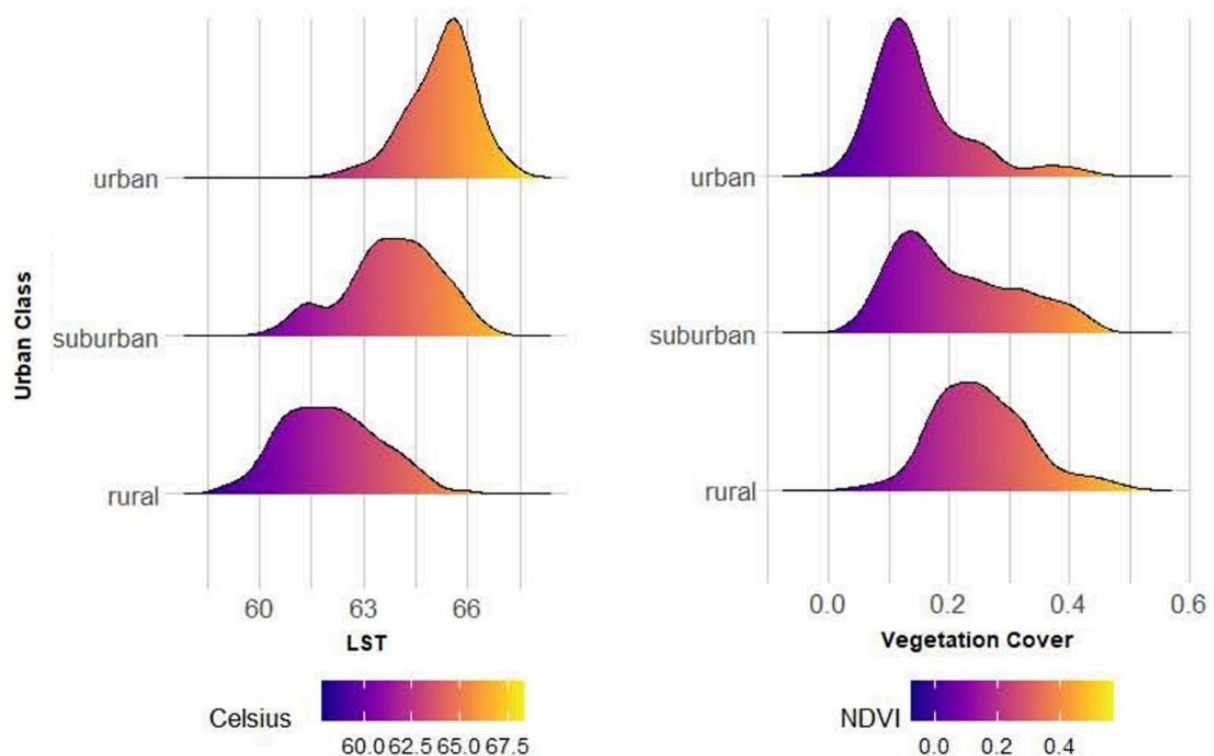


Figure 6. Visualization of surface temperature (LST) and vegetation cover (NDVI) conditions in each urban class at the study site.

Bird community response to environmental factors. As the level of urbanisation increases, vegetation cover declines while land surface temperature increases. This indicates that high-temperature areas are likely to coincide with regions with minimal vegetation (Fig. 6).

The GLMM model with Poisson error distribution showed that LST and NDVI had a significant impact on bird communities at the study site (Sup. Table 3). LST exhibited a negative association (-0.11836 ± 0.0334 , $p \leq 0.001$), while vegetation cover showed a positive association (0.14129 ± 0.03278 , $p \leq 0.001$) with bird species richness in each urban class at the study site. The overdispersion test yielded a chi-squared value of 231.76 with 296 degrees of freedom (overdispersion ratio = 0.78, $p = 0.9977$), indicating no evidence of overdispersion in the model and supporting the appropriateness of the Poisson distribution for modelling species richness (Fig. 7).

The mean body size of bird species decreases as urbanisation intensity increases at the study site. Urban areas are inhabited by bird species with relatively smaller body sizes compared to other classes. The average body size of bird species in each urban class is 16.1 ± 1.85 cm in rural areas, 14.1 ± 1.78 cm in suburban areas, and 10.8 ± 1.67 cm in urban areas (Fig. 8).

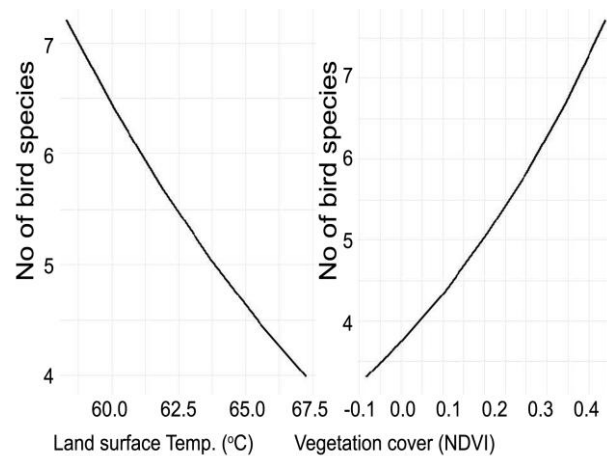


Figure 7. Bird species richness response model to a) land surface temperature (LST) and b) vegetation cover (NDVI).

Discussion

The findings of this study provide evidence that bird communities in DIY urban landscapes are associated with climatic conditions and land use. The bird species recorded were predominantly classified as Urban Exploiters and Urban Adapters, or, in other terms, synurbic species (Mardiastuti *et al.* 2018, 2020). Furthermore, bird species composition across urban classes displayed relatively similar patterns due to the dominance of a few species over others.

Bird community structure can be described by three main components: composition, diversity, and abundance (Clergeau *et al.* 1998). In each urban class, bird community composition was dominated by generalist species, as shown in Sup. Table 1 and Fig. 3, where species such as Javan Munia, Eurasian Tree Sparrow, and Sooty-headed Bulbul were dominant (Fardila & Sjarjadi 2012, Aditya *et al.* 2020). Additionally, omnivorous species predominated in urban areas. This pattern aligns with previous studies on urban bird communities, where urban landscapes are generally dominated by a few synanthropic, omnivorous species (Marzluff 2001, Concepción *et al.* 2015, Abilhoa & Amorin 2017, Isaksson 2018, Mardiasuti *et al.* 2020). The abundance distribution graph (Fig. 3) visually illustrates that urban areas display a relatively steeper slope compared to the other classes (McIntyre 2014). In line with disturbance ecology, greater ecosystem disturbance is associated with more uneven species distributions, resulting in a steeper abundance distribution graph (Battisti *et al.* 2016). Previous studies also suggest that increasing urbanisation levels often correlate with declines in ecosystem quality due to changes in ecosystem and habitat structure (Wan *et al.* 2015, Adams *et al.* 2016, Wang *et al.* 2020, Ouyang *et al.* 2021). Consequently, as urbanization alters landscapes, it impacts the types and availability of habitats for bird species, leading to changes in community composition, diversity, and abundance (Blair & Johnson 2008, Szlavecz *et al.* 2011, Silva *et al.* 2016, Larson *et al.* 2020).

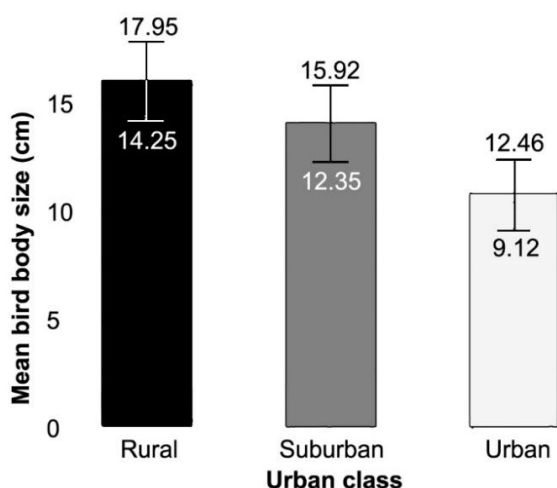


Figure 8. Mean bird body size in each urban class.

In terms of functional groups, insectivorous birds were present across all urban classes (Fig. 2). However, insectivorous species richness

declined with increasing urbanisation. A similar pattern was observed by Pabico *et al.* (2021), where insectivorous species numbers decreased under heightened habitat pressure. This trend may reflect the impact of anthropogenic pressures, which reduce insect density through habitat alterations driven by settlements and built-up areas within urban landscapes (Reichard *et al.* 2001).

All functional groups recorded in this study showed a decline in species richness with increasing urbanisation, except for omnivorous species. Omnivorous species richness increased with increased urbanisation. Species such as the Yellow-vented Bulbul often thrive in disturbed and relatively open habitats (Pabico *et al.* 2021). This finding aligns with previous studies, which indicate that omnivorous species frequently persist in high-pressure environments, such as urbanised areas (Chace & Walsh 2006, Ducatez *et al.* 2015, Coogan *et al.* 2018, Gorosito & Cueto 2020, Pena *et al.* 2023). The presence of omnivorous species in urban areas is related to a relatively broader diet range compared to other species (Jokimäki & Suhonen 1998, Karjee *et al.* 2022). These species often exploit urban areas by consuming human food scraps or waste (Clergeau *et al.* 1998).

Urban areas typically exhibit low bird diversity but high abundance (Clergeau *et al.* 1998, MacGregor-Fors & Schondube 2012, Leveau 2019, Kurucz *et al.* 2021). High bird abundance in urban environments may be attributed to synanthropic species that exploit anthropogenic resources, such as alternative food sources and artificial nesting sites (Isaksson 2018). Bird communities in urban areas often have extensive breeding distributions, high dispersal capabilities, and innovative behaviours in resource utilisation within anthropogenic landscapes (Møller 2009). However, observations from this study showed that bird communities in urban areas exhibited lower abundance compared to other areas. This decline in abundance from rural to urban settings is likely due to the reduction in resources (Villegas & Garitano-Zavala 2010, Evans *et al.* 2018), resulting in comparatively lower abundance than in less disturbed areas (Francis 2015, Battisti *et al.* 2016, Srivastava 2020).

Anthropogenic pressure is not the sole threat to bird communities in urban landscapes; climatic pressures also limit opportunities for birds to access available resources (Isaksson 2018, Guillaumet & Russell 2022). Much like

urbanisation, increasing temperatures contribute to a decline in avian species specialisation by altering habitat suitability and resource availability (Studds and Marra 2007, Tryjanowski *et al.* 2013, Sumasgutner *et al.* 2023). As thermal stress intensifies, species with narrow ecological niches face greater challenges in maintaining viable populations, leading to shifts in community composition (Şekercioğlu *et al.* 2012, van der Hoek *et al.* 2022). In contrast, generalist species with broader thermal tolerance and behavioural plasticity are more likely to persist, resulting in a homogenisation of bird assemblages and a loss of biodiversity at both local and regional scales (Davey *et al.* 2012).

Increasing temperatures combined with the dominance of built-up areas in urban landscapes contribute to the UHI phenomenon (Gu & Li 2018) and it exerts a profound influence on bird community dynamics by modifying species composition, breeding success, foraging behaviour, and survival strategies (Cai *et al.* 2023, Sumasgutner *et al.* 2023, Chen *et al.* 2023). While heat-tolerant generalist species demonstrate resilience and proliferate in urban environments, many specialists and thermally sensitive taxa experience population declines (Jiguet *et al.* 2006, Pipoly *et al.* 2022). This study supports this by demonstrating that urban areas have higher temperatures and lower bird species diversity compared to other areas (Sup. Table 2).

In temperate regions, bird communities in urban areas may benefit from warmer temperatures, which assist in temperature regulation. However, the opposite effect occurs in tropical regions (Wilby & Perry 2006, Isaksson 2018). The results of this study indicate that bird species richness is negatively associated with LST (Figure 7). This could be because bird species in the study area tend to avoid habitats with relatively high temperatures (Cai *et al.* 2023). Veech & Crist (2007) demonstrated that temperature significantly influences community structure, in terms of species richness, across landscapes. Furthermore, high temperatures may impair birds' adaptive abilities, potentially posing a threat to their survival (du Plessis *et al.* 2012, Xie *et al.* 2017). The findings of this study support temperature as a strong predictor of bird diversity in urban areas.

As anthropogenic disturbance intensity increases, bird communities experience a shift towards smaller-bodied species due to thermal regulation advantages, dietary flexibility, higher reproductive success, increased adaptability to

fragmented habitats, and reduced vulnerability to predation and human pressures (Marzluff 2001, Liker *et al.* 2008, Isaksson 2018, Evans *et al.* 2022). In line with this trend, this study found that smaller-bodied birds were more commonly observed in highly urbanised areas, whereas larger-bodied species were more prevalent in rural regions (Fig. 8). These findings are consistent with previous studies indicating that regions with higher temperatures tend to be inhabited by bird species with smaller body sizes (Liker *et al.* 2008, Gardner *et al.* 2011, Weeks *et al.* 2022). This pattern was initially documented by Bergmann (1847), who noted that species in warmer climates generally have smaller body sizes compared to those in colder areas. Bergmann's theory was later supported by Olson *et al.* (2009), who demonstrated that temperature is a major factor driving global differences in bird body sizes. This pattern of declining mean body size is a key indicator of how ecosystems are changing in response to human activities, with long-term implications for biodiversity conservation and ecosystem functioning (Gardner *et al.* 2014).

Adaptation to temperature conditions is related to the ability of smaller birds to dissipate body heat more effectively in high-temperature environments due to their higher surface area-to-volume ratio (Gardner *et al.* 2011). Conversely, larger birds tend to face greater difficulties in responding to high temperatures, rendering them more vulnerable to elevated environmental temperatures (Porter & Kearney 2009, Pattinson *et al.* 2020). While the findings of this study are somewhat broad due to limited investigation of body size within community-level contexts (Weeks *et al.* 2022, Bosco *et al.* 2023), the observed patterns suggest that the urbanisation gradient from rural to urban areas influences not only species distribution but also the community structure of birds based on body size.

In addition to climatic factors, this study demonstrates that spatial factors within the urban landscape, particularly vegetation cover, are associated with bird species richness (Figure 7). Previous research has also identified vegetation cover as a fundamental factor affecting the dynamics of bird communities in urban landscapes (Villegas & Garitano-Zavala 2010, Naithani & Bhatt 2012, Schütz & Schulze 2015, Rodrigues *et al.* 2018, Mardiasuti *et al.* 2020, Novriyanti *et al.* 2021, Prihandi & Nurvianto 2022, Wong *et al.* 2023). Bird species diversity in an area is not necessarily driven by the

diversity of plant species, but rather by the structure of the vegetation, including the extent of vegetation cover (Tworek 2007). Vegetation can provide essential resources for birds, such as food, as well as offering shelter from predators and human disturbances (Murgui 2007, Wood & Esaian 2020, Morelli *et al.* 2021). Moreover, vegetation cover can enhance connectivity for wildlife within urban environments (Morelli *et al.* 2021). Landscape connectivity for wildlife is a crucial component in promoting conservation efforts within areas modified by human activities (Douglas & Sadler 2011).

The vegetation condition and surface temperature at the study site exhibited contrasting spatial patterns, both at the landscape scale and in their influence on bird community responses. Despite the relatively low ecological and biophysical quality of urban environments, this study highlights the continued importance of natural elements, particularly vegetation, in supporting wildlife assemblages. Furthermore, the decline in vegetation cover driven by urban expansion has likely contributed to elevated surface temperatures at the study location (Husna *et al.* 2018, Dewantoro *et al.* 2021, Arif and Toersilowati 2024). Previous research has established that urban vegetation plays a critical role in mitigating surface temperature (Gherri 2023, Yaşlı *et al.* 2023). Assuming a similar relationship exists within the study area, the findings presented here may reflect analogous vegetation-mediated cooling effects, although this study did not explicitly examine the correlation between vegetation cover and LST.

Elevated temperatures in urban areas, combined with habitat pressures that leave only small habitat fragments, contribute to reducing habitat availability for certain species, especially specialist species such as woodpecker (Sup. Table 1; Fröhlich *et al.* 2022, Neate-Clegg *et al.* 2023). This finding aligns with the results of this study, which observed lower bird species richness and dominance of generalist species in urban areas with limited natural habitats. However, further research involving multi-year data is necessary to better understand the effects of environmental changes, particularly spatial and climatic factors, on bird communities. Nevertheless, the findings of this study suggest that the absence of vegetation and elevated temperatures offer valuable insights into bird community responses to environmental pressures in urban landscapes, as noted in previous studies (Gilbert 1989, Cueto & de Casenave 1999, H-

Acevedo & Currie 2003, du Plessis *et al.* 2012, Schwarz *et al.* 2014, Shivanna 2022).

This study provides insights into the relationship between vegetation cover, land surface temperature (LST), and bird species richness within an urbanising landscape. The findings indicate a positive association between bird species richness and vegetation cover, as represented by NDVI, reinforcing the ecological importance of urban green spaces in sustaining avian diversity. Conversely, increasing LST corresponds with lower species richness, suggesting that rising temperatures and UHI effects may impose physiological and habitat constraints on bird communities. Despite the ecological degradation associated with urbanisation, the persistence of natural elements, particularly vegetation, continues to play a crucial role in maintaining biodiversity. The reduction in vegetation cover due to urban expansion has likely contributed to elevated surface temperatures, further exacerbating habitat constraints for thermally sensitive species. These findings highlight the need for conservation-oriented urban planning that prioritises green infrastructure to mitigate the adverse effects of urbanisation on bird communities. Integrating vegetation into urban landscapes can enhance habitat availability, support species persistence, and counteract temperature increases linked to habitat loss. Future research incorporating long-term monitoring, finer-scale habitat assessments, and species-specific thermal tolerances would provide a deeper understanding of how urban environmental changes shape avian biodiversity patterns.

Author contributions

IFN and SN contributed equally; KK improved the discussion on urban forest ecology.

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Research permits

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Supplemental data

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Literature Cited

- Abilhoa, V. & R. Amorin. (2017). Effects of urbanization on the avian community in a southern Brazilian city. *Revista Brasileira de Ornitologia*, 25(1): 31–39.
- Adams, S., P.K. Adom & E.K.M. Klobodu (2016). Urbanization, regime type and durability, and environmental degradation in Ghana. *Environmental Science & Pollution Research*, 23(23): 23825–23839.
- Aditya, A., Sugiyarto, Sunarto *et al.* (2020). The diversity of birds and attractive birds as avitourism objects in Gunung Bromo University Forest, Karanganyar, Central Java. *Zoo Indonesia*, 29(1): 54–66.
- Akbari, H., M. Pomerantz & H. Taha (2001). Cool surfaces and shade trees to reduce energy use and improve air quality in urban areas. *Urban Environment*, 70(3): 295–310.
- Andreasson, F., J.-Å. Nilsson & A. Nord (2020). Avian reproduction in a warming world. *Frontiers in Ecology & Evolution*, 8: 576331.
- Angel, S., J. Parent, D.L. Civco *et al.* (2011). The dimensions of global urban expansion: Estimates and projections for all countries, 2000–2050. *Progress in Planning*, 75(2): 53–107.
- Arif, N. & L. Toersilowati (2024). Monitoring and predicting development of built-up area in sub-urban areas: A case study of Sleman, Yogyakarta, Indonesia. *Heliyon*, 10(14): e34466.
- Aronson, M.F.J., C.A. Lepczyk, K.L. Evans *et al.* (2017). Biodiversity in the city: key challenges for urban green space management. *Frontiers in Ecology & the Environment*, 15(1):189–196.
- Azeem, A., S.R. Ahmed, A. Qadir *et al.* (2021). Predictive habitat suitability modelling of *Axis porcinus* (hog deer) under current and future climate change scenarios in Punjab, Pakistan. *Applied Ecology & Environmental Research*, 19(4): 3181–3201.
- Azman, N.M., S. Latip, S. Anuar *et al.* (2011). Avian diversity and feeding guilds in a secondary forest, an oil palm plantation and a paddy field in riparian areas of the Kerian River Basin, Perak, Malaysia. *Tropical life sciences research*, 22(2): 45–64.
- BPSPDIIY (2022). *Badan Pusat Statistik Provinsi Daerah Istimewa Yogyakarta*. BPS Provinsi D.I. Yogyakarta, Yogyakarta.
- BPSPDIIY (2024). *Badan Pusat Statistik Provinsi Daerah Istimewa Yogyakarta*. Curah Hujan per Bulan <www.yogyakarta.bps.go.id/> Accessed on 7 March 2025.
- Battisti, C., G. Poeta & G. Fanelli (2016). *An introduction to disturbance ecology: A road map for wildlife management and conservation*. Springer, Switzerland: 14pp.
- Bergmann, C (1847). *Über die verhältnisse der wärmeökonomie der thiere zu ihrer grösse*. Vandenhoeck und Ruprecht, Göttingen: 27pp.
- Bibby, C.J., N.D. Burgess, & D.A. Hill (1992). *Bird Census Techniques*. Academic Press, London: 90pp.
- Blair, R.B. & E.M. Johnson (2008). Suburban habitats and their role for birds in the urban–rural habitat network: points of local invasion and extinction? *Landscape Ecology* 23(10): 1157–1169.
- BMKG. 2025. Daily climate data from BMKG <www.dataonline.bmkg.go.id/> Accessed on 7 March 2025.
- Bosco, L., A. Otterbeck, T. Fransson *et al.* (2023). Increasing winter temperatures explain body size decrease in wintering bird populations of Northern Europe—but response patterns vary along the spatioclimatic gradient. *Global Ecology & Biogeography*, 32(12): 2100–2110.
- Buyadi, S.N.A., W. Naim & A. Misni (2014). Impact of vegetation growth on urban surface temperature distribution. *IOP Conference Series: Earth & Environmental Science*, 18(1): 012104.
- Cai, Z., F. La Sorte, Y. Chen *et al.* (2023). The surface urban heat island effect decreases bird diversity in Chinese cities. *The Science of the Total Environment*, 902(1): 166200.
- Chace, J.F. & J.J. Walsh (2006). Urban effects on native avifauna: a review. *Landscape & Urban Planning*, 74(1): 46–69.
- Chen, S., Y. Liu, S. C. Patrick *et al.* (2023). A multidimensional framework to quantify the effects of urbanization on avian breeding fitness. *Ecology & Evolution*, 13(7): e10259.
- Clergeau, P., J.P.L. Savard, G. Mennechez *et al.* (1998). Bird abundance and diversity along an urban-rural gradient: A comparative study

- between two cities on different continents. *The Condor*, 100(3): 413–425.
- Concepción, E.D., M. Moretti, F. Altermatt *et al.* (2015). Impacts of urbanisation on biodiversity: the role of species mobility, degree of specialisation and spatial scale. *Oikos*, 124(12): 1571–1582.
- Congedo, L. (2021). Semi-automatic classification plugin: A Python tool for the download and processing of remote sensing images in QGIS. *Journal of Open-Source Software*, 6(64): 3172.
- Congedo, L. & S. Macchi (2015). The demographic dimension of climate change vulnerability: exploring the relation between population growth and urban sprawl in Dar es Salaam. *Current Opinion in Environmental Sustainability*, 13(1): 1–10.
- Coogan, S.C.P., D. Raubenheimer, S.P. Zantis *et al.* (2018). Multidimensional nutritional ecology and urban birds. *Ecosphere*, 9(4): e02177.
- Crawley, M.J. (2013). *The R book*. 2nd edition. Wiley, Chichester: 324pp.
- Cueto, V.R. & J.L. de Casenave. (1999). Determinants of bird species richness: role of climate and vegetation structure at a regional scale. *Journal of Biogeography*, 26(3): 487–492.
- Davey, C.M., D.E. Chamberlain, S.E. Newson *et al.* (2012). Rise of the generalists: evidence for climate driven homogenization in avian communities. *Global Ecology & Biogeography*, 21(5): 568–578.
- Dewantoro, B.E.B., M.A. Khafid, A.D.A. Putra *et al.* (2021). Identification of the impact of vegetation cover changes and the development of urban areas on Urban Heat Island using GIS and remote sensing: A case study of Sleman regency, Province of Yogyakarta. *IOP Conference Series: Materials Science & Engineering*, 1098(5): 052023.
- Douglas, I. & J.P. Sadler (2011). Urban wildlife corridors: Conduits for movement or linear habitat? Pp. 274–288. In: Douglas, I. *et al.* (eds.). *The Routledge Handbook of Urban Ecology*. Routledge, Oxon.
- Dröge, S., D.A. Martin, R. Andriafanomezantsoa *et al.* (2021). Listening to a changing landscape: Acoustic indices reflect bird species richness and plot-scale vegetation structure across different land-use types in north-eastern Madagascar. *Ecological Indicators*, 120(1): 106929.
- du Plessis, K.L., R.O. Martin, P.A.R. Hockey *et al.* (2012). The costs of keeping cool in a warming world: implications of high temperatures for foraging, thermoregulation and body condition of an arid-zone bird. *Global Change Biology*, 18(10): 3063–3070.
- Ducatez, S., J. Clavel & L. Lefebvre (2015). Ecological generalism and behavioural innovation in birds: technical intelligence or the simple incorporation of new foods? *Journal of Animal Ecology*, 84(1): 79–89.
- Eaton, J.A., B. van Balen, N.W. Brickley *et al.* (2016). *Birds of the Indonesian Archipelago. Greater Sundas and Wallacea*. Lynx Edicions, Barcelona: 26pp.
- Estevo, C.A., M.B. Nagy-Reis & W.R. Silva (2017). Urban parks can maintain minimal resilience for neotropical bird communities. *Urban Forestry & Urban Greening*, 27(1): 84–89.
- Evans, B.A., J.A. Klassen & D.E. Gawlik (2022). Dietary flexibility of wood Storks in response to human-induced rapid environmental change. *Urban Ecosystems*, 25(3): 705–718.
- Evans, B.S., R. Reitsma, A.H. Hurlbert *et al.* (2018). Environmental filtering of avian communities along a rural-to-urban gradient in Greater Washington, D.C., USA. *Ecosphere*, 9(11): e02402.
- Evans, K.L., S.E. Newson & K.J. Gaston (2009). Habitat influences on urban avian assemblages. *Ibis*, 151(1): 19–39.
- Fardila, D. & A. Sjarmidi (2012). Bird distribution along environmental gradients in North Bandung, West Java. *Research Journal of Recent Sciences*, 1(ISC-2011): 2502.
- Ferrini, F., A. Fini, J. Mori *et al.* (2020). Role of Vegetation as a Mitigating Factor in the Urban Context. *Sustainability*, 12(10): 4247.
- Fernández-Juricic, E. (2004). Spatial and temporal analysis of the distribution of forest specialists in an urban-fragmented landscape (Madrid, Spain): Implications for local and regional bird conservation. *Landscape & Urban Planning*, 69(1): 17–32.
- Fraixedas, S., A. Lindén, M. Piha *et al.* (2020). A state-of-the-art review on birds as indicators of biodiversity: Advances, challenges, and future directions. *Ecological Indicators*, 118(1): 106728.
- Francis, C.D. (2015). Vocal traits and diet explain avian sensitivities to anthropogenic noise. *Global Change Biology*, 21(5): 1809–20.
- Francis, R.A. & M.A. Chadwick (2012). What makes a species synurbic? *Applied Geography*, 32(2): 514–521.
- Freeman, M.T., Z.J. Czenze, K. Schoeman *et al.* (2020). Extreme hyperthermia tolerance in the world's most abundant wild bird. *Scientific Reports*, 10(1): 13098.

- Fröhlich, A., P. Hawryło & M. Ciach (2022). Urbanization filters woodpecker assemblages: Habitat specialization limits population abundance of dead wood-dependent organisms in the urban landscape. *Global Ecology & Conservation*, 38(1): e02220.
- Gardner, J.L., T. Amano, P.R.Y. Backwell *et al.* (2014). Temporal patterns of avian body size reflect linear size responses to broad-scale environmental change over the last 50 years. *Journal of Avian Biology*, 45(6): 529–535.
- Gardner, J.L., A. Peters, M.R. Kearney *et al.* (2011). Declining body size: a third universal response to warming? *Trends in Ecology & Evolution*, 26(6): 285–291.
- Garnier, S., N. Ross, R. Rudis *et al.* (2021). Rvision-colorblind-friendly color maps for R. R package version 0.6.2.
- Gaur, P., C. Shrivastava & S. Gaherwal (2020). Assessment of Shannon Wiener Index of Birds in various regions of Indore City, Indore, Madhya Pradesh. *Ecology, Environment & Conservation*, 26(4): 1710–1715.
- Gherri, B. (2023). The role of urban vegetation in counteracting overheating in different urban textures. *Land*, 12(12): 2100.
- Gilbert, O.L. (1989). *The Ecology of Urban Habitats*. Chapman and Hall, New York.
- Gorelick, N., M. Hancher, M. Dixon (2017). Google Earth Engine: Planetary-scale geospatial analysis for everyone. *Remote Sensing of Environment*, 202(3): 18–27.
- Gorosito, C.A. & V.R. Cueto (2020). Do small cities affect bird assemblages? An evaluation from Patagonia. *Urban Ecosystems*, 23(2): 289–300.
- Gregory, R., D. Noble, R. Field *et al.* (2003). Using birds as indicators of biodiversity. *Ornis Hungarica*, 12(1): 11–24.
- Gu, W., J. Guo, K. Fan *et al.* (2016). Dynamic land use change and sustainable urban development in a third-tier city within Yangtze Delta. *Procedia Environmental Sciences*, 36(1): 98–105.
- Gu, Y. & D. Li (2018). A modeling study of the sensitivity of urban heat islands to precipitation at climate scales. *Urban Climate*, 24(1): 982–993.
- Guillaumet, A. & I.J. Russell (2022). Bird Communities in a changing world: The role of interspecific competition. *Diversity*, 14(10): 857.
- Günlü, A., E.Z. Başkent, A.İ. Kadioğulları *et al.* (2009). Forest site classification using Landsat 7 ETM data: A case study of Maçka-Ormanüstü forest, Turkey. *Environmental Monitoring & Assessment*, 151(1): 93–104.
- H-Acevedo, D. & D.J. Currie (2003). Does climate determine broad-scale patterns of species richness? A test of the causal link by natural experiment. *Global Ecology & Biogeography*, 12(6): 461–473.
- Hadi, M.A., S. Narayana, M.S. Yahya *et al.* (2024). Enhancing bird conservation in tropical urban parks through land sparing and sharing strategies: Evidence from occupancy data. *Urban Forestry & Urban Greening*, 98(1): 128415.
- Hadinoto, H., L. Zalizar, J. Triwanto *et al.* (2023). Bird diversity, abundance, and evenness rates in ecotone area of Sutan Syarif Hasyim Forest Park, Riau, Indonesia. *E3S Web of Conferences*, 374(2).
- Hammer, O., D. Harper & P. Ryan (2001). PAST: Paleontological statistics software package for education and data analysis. *Palaeontologia Electronica*, 4(1): 1–9.
- Husna, V.N., N.I. Fawzi & I.A. Nur (2018). Measuring and mitigating urban heat island in yogyakarta city using remote sensing. *International Journal of Scientific & Technology Research*, 7(7): 57–60.
- Ikhumen, H.O., T. Li, S. Lu *et al.* (2020). Assessment of a novel data driven habitat suitability ranking approach for *Larus relictus* specie using remote sensing and GIS. *Ecological Modelling*, 432(1): 109221.
- Isaksson, C. (2018). Impact of Urbanization on Birds. Pp. 235–257. In: Tietze, D.T. (eds.). *Bird Species: How They Arise, Modify and Vanish*. Springer, Cham.
- Jernakoff, M.G., J.L. Knowlton, B. Vásquez-Ávila *et al.* (2023). Effects of land use change on the functional diversity and composition of mixed species avian flocks in the high tropical Andes of southern Ecuador. *Journal of Field Ornithology*, 94(1): 3.
- Jiguet, F., R. Julliard, C.D. Thomas *et al.* (2006). Thermal range predicts bird population resilience to extreme high temperatures. *Ecology Letters*, 9(12): 1321–1330.
- Jimenez, A.G. & J.B. Williams (2014). Rapid changes in cell physiology as a result of acute thermal stress house sparrows, *Passer domesticus*. *Journal of Thermal Biology*, 46(1): 31–39.
- Jokimäki, J. & J. Suhonen (1998). Distribution and habitat selection of wintering birds in urban environments. *Landscape & Urban Planning*, 39(4): 253–263.
- Kaban, A., A. Mardiatuti & L. Prasetyo (2018). Landscape structure affects bird community in Bogor, West Java. *Jurnal Penelitian Kehutanan Wallacea*, 7(2): 109–118.

- Karjee, R., H.S. Palei, A. Konwar *et al.* (2022). Bird Assemblages in a peri-urban landscape in eastern India. *Birds*, 3(4): 383–401.
- Kassambara, A. (2023). ggpubr: “ggplot2” Based publication ready plots. R package version 0.6.0.
- Knutson, M.G., L. O’Brien, T.W. Sutherland *et al.* (2016). *National Protocol Framework for the Inventory and Monitoring of Breeding Landbirds Using Point Counts*. Natural Resources Program Center, Fort Collins, CO.: 62pp.
- Kontsiotis, V., S. Chatzigiovanakis, E. Valsamidis *et al.* (2023). Normalized difference vegetation index as a proxy of urban bird species presence and distribution at different spatial scales. *Diversity*, 15(11): 1139.
- Kurucz, K., J.J. Purger & P. Batáry (2021). Urbanization shapes bird communities and nest survival, but not their food quantity. *Global Ecology & Conservation*, 26(1): e01475.
- Larson, R.N., J.L. Brown, T. Karels *et al.* (2020). Effects of urbanization on resource use and individual specialization in coyotes (*Canis latrans*) in southern California. *PLOSOne*, 15(2): e0228881.
- Leveau, L.M. (2021). Consistency in bird community assembly over medium-term along rural-urban gradients in Argentina. *Ecological Processes*, 10(1): 34.
- Liker, A., Z. Papp, V. Bókony *et al.* (2008). Lean birds in the city: body size and condition of house sparrows along the urbanization gradient. *Journal of Animal Ecology*, 77(4): 789–795.
- Lima Alves, E. & A. Lopes (2017). The urban heat island effect and the role of vegetation to address the negative impacts of local climate change in a small Brazilian city. *Atmosphere*, 8(2): 18.
- Londoño, G.A., M.A. Chappell, M.D.R. Castañeda *et al.* (2015). Basal metabolism in tropical birds: latitude, altitude, and the ‘pace of life.’ *Functional Ecology*, 29(3): 338–346.
- Luniak, M. (2004). Synurbization - adaptation of animal wildlife to urban development. Pp. 50–55. In: Shaw, L.K. *et al.* (eds.). *Proceedings of the 4th International Symposium on Urban Wildlife Conservation*. University of Arizona, Tucson, Arizona.
- MacGregor-Fors, I. & J. Schondube (2012). Urbanizing the wild: Shifts in bird communities associated to small human settlements. *Revista Mexicana de Biodiversidad*, 83(2): 477–486.
- MacKinnon, J., K. Phillips, B. van Balen (2010). *Burung – burung di Sumatera, Jawa, Bali, dan Kalimantan*. Puslitbang Biologi LIPI, Bogor.
- Magurran, A.E. (2004). *Measuring Biological Diversity*. Blackwell Publishing, Oxford: 22pp.
- Mahata, N. & H.P. Sharma (2023). Birds along the Bagmati river corridor in urban areas and factors affecting their abundance. *Environmental Challenges*, 11(3): 100685.
- Manhães, M.A. & A. Loures-Ribeiro (2005). Spatial distribution and diversity of bird community in an urban area of Southeast Brazil. *Brazilian Archives of Biology & Technology*, 48(2): 285–294.
- Marasinghe, M.S.L.R.P., N.D.K. Dayawansa & R.P.D. Silva (2015). Area suitability prediction for conserving elephants: an application of likelihood ratio prediction model. *Tropical Agricultural Research*, 25(3): 345.
- Mardiastuti, A., Y. Mulyani, A. Asmoro *et al.* (2018). Bird community in urban residential area: Which species sustained after five elapse years? *IOP Conference Series: Earth & Environmental Science*, 179(1): 012040.
- Mardiastuti, A., Y. Mulyani, D. Rinaldi *et al.* (2020). Synurbic avian species in Greater Jakarta Area, Indonesia. *IOP Conference Series: Earth & Environmental Science*, 457(1): 012001.
- Marzluff, J.M. (2001). Worldwide urbanization and its effects on birds. Pp. 19–47. In: Marzluff, J.M. *et al.* (eds.). *Avian Ecology and Conservation in an Urbanizing World*. Springer, Boston.
- Marzluff, J.M., R. Bowman & R. Donnelly (2001). A historical perspective on urban bird research: trends, terms, and approaches. Pp. 1–17. In: Marzluff, J.M. (eds.). *Avian Ecology and Conservation in an Urbanizing World*. Springer, Boston.
- McIntyre, N.E. (2014). Wildlife responses to urbanization: Patterns of diversity and community structure in built environments. Pp. 103–115. In: McCleery, R.A. *et al.* (eds.). *Urban Wildlife Conservation: Theory and Practice*. Springer, Boston.
- Mekonen, S. (2017). Birds as biodiversity and environmental indicators. *Advances in Life Science & Technology*, 60(1): 16–22.
- Møller, A.P. (2009). Successful city dwellers: a comparative study of the ecological characteristics of urban birds in the Western Palearctic. *Oecologia*, 159(4): 849–858.
- Monge, O., I. Maggini, C. H. Schulze *et al.* (2023). Physiologically vulnerable or resilient? Tropical birds, global warming, and redistributions. *Ecology & Evolution*, 13(4): e9985.
- Morelli, F., J. Reif, M. Díaz *et al.* (2021). Top ten bird indicators of high environmental quality in

- European cities. *Ecological Indicators*, 133(1): 108397.
- Morin, P.J. (2011). *Community Ecology*. 2nd Edition. Wiley-Blackwell, West Sussex: 279pp.
- Muhammad, G., A. Mardiasuti & T. Sunarminto (2018). Species and feeding-guild diversity of avifauna at Gunung Pinang, Kramatwatu, Serang Regency, Banten. *Media Konservasi*, 23(2): 178–186.
- Murgui, E. (2007). Effects of seasonality on the species-area relationship: A case study with birds in urban parks. *Global Ecology & Biogeography*, 16(3): 319–329.
- Naithani, A. & D. Bhatt (2012). Bird community structure in natural and urbanized habitats along an altitudinal gradient in Pauri district (Garhwal Himalaya) of Uttarakhand state, India. *Biologia*, 67(4): 800–808.
- Neate-Clegg, M.H.C., M.A. Etersson, M.W. Tingley *et al.* (2023). The combined effects of temperature and fragment area on the demographic rates of an Afrotropical bird community over 34 years. *Biological Conservation*, 282(1): 110051.
- Nieto, S., P. Flombaum & M. F. Garbulsky (2015). Can temporal and spatial NDVI predict regional bird-species richness? *Global Ecology & Conservation*, 3(1): 729–735.
- Noakes, M.J., B.O. Wolf, & A.E. McKechnie (2016). Seasonal and geographical variation in heat tolerance and evaporative cooling capacity in a passerine bird. *Journal of Experimental Biology*, 219(6): 859–869.
- Novriyanti, N., I. Ihsan, B. Irawan *et al.* (2021). Fragmented urban areas: Can plants encourage birds in Jambi City urban space? *IOP Conference Series: Earth & Environmental Science*, 918(1): 012028.
- Olofsson, P., G. M. Foody, M. Herold *et al.* (2014). Good practices for estimating area and assessing accuracy of land change. *Remote Sensing of Environment*, 148(1):42–57.
- Olson, V.A., R.G. Davies, C.D.L. Orme *et al.* (2009). Global biogeography and ecology of body size in birds. *Ecology Letters*, 12(3): 249–259.
- Oropeza-Sánchez, M.T., I. Solano-Zavaleta, W.L. Cuandón-Hernández *et al.* (2025). Urban green spaces with high connectivity and complex vegetation promote occupancy and richness of birds in a tropical megacity. *Urban Ecosystems*, 28(1): 50.
- Ortega-Álvarez, R. & I. MacGregor-Fors (2009). Living in the big city: Effects of urban land-use on bird community structure, diversity, and composition. *Landscape & Urban Planning*, 90(3): 189–195.
- Ouyang, X., L. Tang, X. Wei *et al.* (2021). Spatial interaction between urbanization and ecosystem services in Chinese urban agglomerations. *Land Use Policy*, 109(1): 105587.
- Pabico, L., M. Duya, J. Fidelino *et al.* (2021). Bird feeding guild assemblage along a disturbance gradient in the Pantabangan-Carranglan Watershed and Forest Reserve, Central Luzon Island, Philippines. *Philippine Journal of Science*, 150(S1): 237–251.
- Pattinson, N.B., M.L. Thompson, M. Griego *et al.* (2020). Heat dissipation behaviour of birds in seasonally hot arid-zones: are there global patterns? *Journal of Avian Biology*, 51(2): e02350.
- Pauw, A. & K. Louw (2012). Urbanization drives a reduction in functional diversity in a guild of nectar-feeding birds. *Ecology & Society*, 17(2): 27.
- Pena, J.C., O. Ovaskainen, I. MacGregor-Fors *et al.* (2023). The relationships between urbanization and bird functional traits across the streetscape. *Landscape & Urban Planning*, 232(1): 104685.
- Pennington, D. & R. Blair (2012). Using gradient analysis to uncover pattern and process in urban bird communities. Pp. 8–31. In: Lepczyk, C.A. & P.S. Warren (eds.). *Urban Bird Ecology and Conservation*. University of California Press, California.
- Petersen, T.K., J.D.M. Speed, V. Grøtan *et al.* (2022). Urbanisation and land-cover change affect functional, but not compositional turnover of bird communities. *Urban Ecosystems*, 25(6): 1679–1698.
- Pipoly, I., B. Preiszner, K. Sándor *et al.* (2022). Extreme hot weather has stronger impacts on avian reproduction in forests than in cities. *Frontiers in Ecology & Evolution*, 10: 825410.
- Pis, T. (2010). The link between metabolic rate and body temperature in galliform birds in thermoneutral and heat exposure conditions: The classical and phylogenetically corrected approach. *Journal of Thermal Biology*, 35(6): 309–316.
- Porter, W.P. & M. Kearney (2009). Size, shape, and the thermal niche of endotherms. *Proceedings of the National Academy of Sciences*, 106(Sup 2): 19666–19672.
- Prihandi, D. & S. Nurvianto (2022). The role of urban green space design to support bird community in the urban ecosystem. *Biodiversitas Journal of Biological Diversity*, 23(4): 2137–2145.
- Pudyatmoko, S., Kaharuddin & S. Nurvianto (2009). Role of urban environment on conservation of bird diversity in Java,

- Indonesia. *Journal of Biological Sciences*, 9(4): 345–350.
- QGIS (2009). QGIS Development Team. QGIS Geographic Information System. Open-Source Geospatial Foundation. QGIS Association.
- R Core Team (2024). R: A language and environment for statistical computing. R: Foundation for Statistical Computing, Vienna, Austria.
- Rahman, D.A., Y. Santosa, I. Purnamasari *et al.* (2022). Drivers of three most charismatic mammalian species distribution across a multiple-use tropical forest landscape of Sumatra, Indonesia. *Animals*, 12(19): 2722.
- Reichard, S.H., L. Chalker-Scott & S. Buchanan (2001). Interactions among non-native plants and birds. Pp. 179–223. In: Marzluff, J.M. *et al.* (eds.). *Avian Ecology and Conservation in an Urbanizing World*. Springer, Boston.
- Rodrigues, A., M. Borges-Martins & F. Zilio (2018). Bird diversity in an urban ecosystem: The role of local habitats in understanding the effects of urbanization. *Iheringia Série Zoologia*, 108(1): 1–11.
- Rozano, B. & W. Yan (2018). Monitoring the transformation of Yogyakarta's urban form using remote sensing and Geographic Information System. *IOP Conference Series: Earth & Environmental Science*, 148(1): 012010.
- Rózová, Z., J. Supuka, J. Klein *et al.* (2020). Effect of vegetation structure on urban climate mitigation. *Acta Horticulturae et Regiotecturae*, 23(2): 60–65.
- Rudis B. (2020). *hrbrthemes: Additional Themes, Theme Components and Utilities for "ggplot2."* R package version 0.8.0.
- Rumblat, W., A. Mardiasuti & Y.A. Mulyani. (2016). Guild pakan komunitas burung di DKI Jakarta. *Media Konservasi*, 21(1): 58–64.
- Rushayati, S.B., A.D. Shamila & L.B. Prasetyo (2018). The role of vegetation in controlling air temperature resulting from urban heat island. *Forum Geografi*, 32(1): 1–11.
- Saka, M.G., G.S. Mamman & A. Adedotun (2022). Comparison of Shannon-Weinner's and Simpson's indices for estimating bird species diversity in Bodel forest of Gashaka Gumti national park, Nigeria. *Journal of Entomology & Zoology Studies*, 10(2): 144–151.
- Sandoval, T., V. Orlando, S. Ramos *et al.* (2024). Vegetation as a regulator of urban climate: the case of the Guadalajara metropolitan zone, Jalisco, Mexico. *Investigaciones geográficas*, 1(114): e60849.
- Sari, I.L., C.J. Weston, G.J. Newnham *et al.* (2021). Estimating land cover map accuracy and area uncertainty using a confusion matrix: A case study in Kalimantan, Indonesia. *IOP Conference Series: Earth & Environmental Science*, 914(1): 012025.
- Schütz, C. & C. Schulze (2015). Functional diversity of urban bird communities: Effects of landscape composition, green space area and vegetation cover. *Ecology & evolution*, 5(22): 5230–5239.
- Schwarz, K., D.L. Herrmann & M.R. McHale (2014). Abiotic drivers of ecological structure and function in urban systems. Pp. 55–74. In: McCleery, R.A. *et al.* (eds.). *Urban Wildlife conservation: Theory and Practice*. Springer, Boston.
- Şekercioglu, Ç.H., R.B. Primack & J. Wormworth (2012). The effects of climate change on tropical birds. *Biological Conservation*, 148(1): 1–18.
- Selang, M.A., D.A. Iskandar & R.W.D. Pramono (2018). Tingkat perkembangan urbanisasi spasial di pinggiran KPY (Kawasan Perkotaan Yogyakarta) tahun 2012-2016. *Prosiding Seminar Nasional Kota Layak Huni "Urbanisasi dan Pengembangan Perkotaan"*, 1(1): 32–40.
- Shafie, N.J., H. Anuar, G. David *et al.* (2023). Bird species composition, density and feeding guilds in contrasting lowland dipterocarp forests of Terengganu, Peninsular Malaysia. *Tropical Ecology*, 64(2): 238–248.
- Shivanna, K.R. (2022). Climate change and its impact on biodiversity and human welfare. *Proceedings of the Indian National Science Academy*, 88(2): 160–171.
- Silva, C.P., R.D. Sepúlveda & O. Barbosa (2016). Nonrandom filtering effect on birds: species and guilds response to urbanization. *Ecology & Evolution*, 6(11): 3711–3720.
- Silva, J.P., I. Catry, J.M. Palmeirim *et al.* (2015). Freezing heat: thermally imposed constraints on the daily activity patterns of a free-ranging grassland bird. *Ecosphere*, 6(7): 1–13.
- Smith, W., F. Silva, S. Amorim *et al.* (2018). Urban biodiversity: how the city can do its management? *Biodiversity International Journal*, 2(3): 246–251.
- Solecki, W. D., C. Rosenzweig, L. Parshall *et al.* (2005). Mitigation of the heat island effect in urban New Jersey. *Global Environmental Change Part B: Environmental Hazards*, 6(1): 39–49.
- Srivastava, R.K. (2020). *Managing Urbanization, Climate Change and Disasters in South Asia*. Springer, New Delhi: 241pp.
- St-Pierre, A.P., V. Shikon & D.C. Schneider (2018). Count data in biology-Data

- transformation or model reformation? *Ecology & Evolution*, 8(6): 3077–3085.
- Studds, C.E. & P.P. Marra (2007). Linking fluctuations in rainfall to nonbreeding season performance in a long-distance migratory bird, *Setophaga ruticilla*. *Climate Research*, 35(1): 115–122.
- Suarez-Castro, A.F., R.R.Y. Oh, A.I.T. Tulloch *et al.* (2024). Landscape structure influences the spatial distribution of urban bird attractiveness. *Landscape Ecology*, 39(8): 149.
- Sumasgutner, P., S.J. Cunningham, A. Hegemann *et al.* (2023). Interactive effects of rising temperatures and urbanisation on birds across different climate zones: A mechanistic perspective. *Global Change Biology*, 29(9): 2399–2420.
- Suripto, B.A., N. Lindasari & N. Hendry (2020). Campuses in Yogyakarta as a bird habitat. *The 6th International Conference on Biological Science ICBS 2019: “Biodiversity as a Cornerstone for Embracing Future Humanity”*, Yogyakarta: 020014.
- Susca, T., S.R. Gaffin & G.R. Dell’Osso (2011). Positive effects of vegetation: Urban heat island and green roofs. *The conference UEP2010, 20-23 June 2010, Boston*, 159:2119–2126.
- Szlavec, K., P. Warren & S. Pickett (2011). Biodiversity on the urban landscape. Pp. 75–101. In: Cincotta, R.P. & L.J. Gorenflo (eds.). *Human Population: Its Influences on Biological Diversity*. Springer Berlin Heidelberg.
- Tassicker, A., A. Kutt, E. Vanderduys *et al.* (2006). The effects of vegetation structure on the birds in a tropical savanna woodland in north-eastern Australia. *Rangeland Journal*, 28(2): 139–152.
- Taufiqurrahman, I., P.G. Akbar, A.A. Purwanto *et al.* (2022). *Panduan Lapangan burung-burung di Indonesia Seri 1: Sunda Besar*. Birdpacker Indonesia-Interlude, Batu.
- Teimouri, R., R. Ghorbani, P. Karbasi *et al.* (2023). Investigation of land use changes using the landscape ecology approach in Maragheh City, Iran. *Journal of Environmental Studies & Sciences*, 13(2): 271–284.
- Teng, J., S. Xia, Y. Liu *et al.* (2021). Assessing habitat suitability for wintering geese by using Normalized Difference Water Index (NDWI) in a large floodplain wetland, China. *Ecological Indicators*, 122(1): 107260.
- Titoko, R., J.H. Lowry, T. Osborne *et al.* (2019). Relationship of bird richness, abundance and assemblage to the built environment in a small island tropical urban setting: a Suva, Fiji case study. *Urban Ecosystems*, 22(4): 709–719.
- Tworek, S. (2007). Factors affecting bird species diversity on a local scale: A case study of a mosaic landscape in southern Poland. *Polish Journal of Ecology*, 55(4): 771–782.
- Tryjanowski, P., T. Sparks, S. Kuźniak *et al.* (2013). Bird migration advances more strongly in urban environments. *PLOSOne*, 8(5): e63482.
- Ulrich, W., M. Olrik & K.I. Ugland (2010). A meta-analysis of species—abundance distributions. *Oikos*, 119(7): 1149–1155.
- UNOOSA (2025). United Nations Office for Outer Space Affairs. n.d. Step-by-Step: Land Cover Change Detection through Supervised Classification <<https://un-spider.org/>> Accessed on 22 February 2023.
- Utama, A.A. & S. Nurvianto (2022). The building size effect on bird community assemblages in tropical urban ecosystem. *Biodiversitas*, 23(5): 2775–2782.
- van der Hoek, Y., C. Sirami, E. Faida *et al.* (2022). Elevational distribution of birds in an Eastern African montane environment as governed by temperature, precipitation, and habitat availability. *Biotropica*, 54(2): 334–345.
- Veech, J.A. & T.O. Crist (2007). Habitat and climate heterogeneity maintain beta-diversity of birds among landscapes within ecoregions. *Global Ecology & Biogeography*, 16(5): 650–656.
- Villegas, M. & Á. Garitano-Zavala (2010). Bird community responses to different urban conditions in La Paz, Bolivia. *Urban Ecosystems*, 13(3): 375–391.
- Vujovic, S., B. Haddad, H. Karaky *et al.* (2021). Urban Heat Island: causes, consequences, and mitigation measures with emphasis on reflective and permeable pavements. *CivilEng*, 2(2): 459–484.
- Wacano, D., N. Latifah, H. Bishop *et al.* (2021). Landscapes vulnerability on climate change in Yogyakarta Province, Indonesia. *IOP Conference Series: Earth & Environmental Science*, 933(1): 012027.
- Wan, L., X. Ye, J. Lee *et al.* (2015). Effects of urbanization on ecosystem service values in a mineral resource-based city. *Habitat International*, 46(1): 54–63.
- Wang, Y., X. Lu, R. Wang *et al.* (2023). Identification of bird habitat restoration priorities in a central area of a megacity. *Forests*, 14(8): 1689.
- Wang, G., D. Han, X. Qin *et al.* (2020). A comprehensive method for studying pore structure and seepage characteristics of coal mass based on 3D CT reconstruction and NMR. *Fuel*, 281(1): 118735.
- Weathers, W.W. (1997). Energetics and thermoregulation by small passerines of the

- humid, lowland tropics. *The Auk*, 114(3): 341–353.
- Weeks, B.C., M. Klemz, H. Wada *et al.* (2022). Temperature, size and developmental plasticity in birds. *Biology Letters*, 18(12): 20220357.
- Weng, Y.C. (2011). Developing urban adaptation strategies for global warming by using data mining techniques: a case study of major metropolitan areas in Japan. Pp. 69–92. In: Casalegno, S. (eds.). *Global Warming Impacts-Case Studies on The Economy, Human Health, and on Urban and Natural Environments*. InTech, Croatia.
- Wiersma, P., A. Muñoz-Garcia, A. Walker *et al.* (2007). Tropical birds have a slow pace of life. *Proceedings of the National Academy of Sciences*, 104(22): 9340–9345.
- Wickham, H. 2016. *ggplot2: Elegant Graphics for Data Analysis*. Springer, New York: 6pp.
- Widiyastuti, D., B. Mudiantoro & L. Andriyani. (2020). Investigating urban space: Potential urban green space in dense city of Yogyakarta. *E3S Web of Conferences*, 200(1): 07002.
- Wilby, R.L. & G.L.W. Perry (2006). Climate change, biodiversity and the urban environment: a critical review based on London, UK. *Progress in Physical Geography: Earth & Environment*, 30(1): 73–98.
- Wilke, C.O. (2022). *ggribes: Ridgeline Plots in “ggplot2.” R package version 0.5.4.*
- Wong, J.S.Y., M.C.K. Soh, B.W. Low *et al.* (2023). Tropical bird communities benefit from regular-shaped and naturalised urban green spaces with water bodies. *Landscape & Urban Planning*, 231(1): 104644.
- Wood, E.M. & S. Esaian (2020). The importance of street trees to urban avifauna. *Ecological Applications*, 30(7): e02149.
- Woodworth, B.K., D.R. Norris, B.A. Graham *et al.* (2018). Hot temperatures during the dry season reduce survival of a resident tropical bird. *Proceedings of the Royal Society B: Biological Sciences*, 285(1878): 20180176.
- Wredaningrum, I. & S. Sudibyakto (2014). Analisis perubahan zona agroklimat Daerah Istimewa Yogyakarta ditinjau dari klasifikasi iklim menurut oldeman. *Jurnal Bumi Indonesia*, 3(4): 1–10.
- Wuragil, Z. (2021). BMKG sebut suhu udara Yogyakarta semakin panas, simak datanya <www.tempo.co> Accessed on 10 January 2023.
- Xie, S., L.M. Romero, Z.W. Htut *et al.* (2017). Stress responses to heat exposure in three species of australian desert birds. *Physiological & Biochemical Zoology*, 90(3): 348–358.
- Xu, Q., L. Zhou, S. Xia *et al.* (2022). Impact of urbanisation intensity on bird diversity in river wetlands around Chaohu Lake, China. *Animals*, 12(4): 473.
- Xu, X., Y. Xie, K. Qi *et al.* (2018). Detecting the response of bird communities and biodiversity to habitat loss and fragmentation due to urbanization. *Science of The Total Environment*, 624(1): 1561–1576.
- Yaşlı, R., C. Yücedağ, S. Ayan *et al.* (2023). The Role of urban trees in reducing land surface temperature. *SilvaWorld*, 2(1): 36–49.
- Yeom, D.J. & J. Kim (2011). Comparative evaluation of species diversity indices in the natural deciduous forest of Mt. Jeombong. *Forest Science & Technology*, 7(2): 68–74.
- Zanaga, D., R. Van De Kerchove, W. De Keersmaecker *et al.* (2021). ESA WorldCover 10 m 2020 v100. Zenodo. Available from <<https://zenodo.org/records/5571936>>
- Zhai, Z., S. Liu, Z. Li *et al.* (2024). The spatiotemporal distribution patterns and impact factors of bird species richness: A case study of urban built-up areas in Beijing, China. *Ecological Indicators*, 169(1): 112847.
- Zhao, J., X. Zhao, S. Liang *et al.* (2020). Assessing the thermal contributions of urban land cover types. *Landscape & Urban Planning*, 204(1): 103927.
- Zuur, A.F., E.N. Ieno & C.S. Elphick (2010). A protocol for data exploration to avoid common statistical problems. *Methods in Ecology & Evolution*, 1(1): 3–14.