A standard protocol for harvesting biodiversity data from Facebook

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- 37

38 Author contributions

- 39 SC conceptualised the idea; SC developed the method; SC, SuA, ShA, PD, MML, MR, and AS
- 40 collected the data; SC did the analysis; everyone contributed to the analysis; SC wrote the
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46 Data availability

47 Our extracted Facebook data are publicly available (Chowdhury et al., 2022b).

49 Abstract

- 50 1. The expanding use of citizen science platforms has led to an exponential increase in
- 51 biodiversity data in global repositories. Yet, our understanding of species distribution
- 52 remains patchy for most of the world. Social media data has the potential to reduce the
- 53 global biodiversity knowledge gap. However, practical guidelines and standardised pipelines
- 54 to harvest such data sources are still missing.
- 2. Here, we provide a standardised framework to extract species distribution records from
- 56 Facebook groups that allow access to their data following data privacy and protection
- 57 safeguards. Some countries actively use and moderate Facebook groups to share species
- records. We present how to structure keywords, search for species photographs, and
- 59 georeference localities for such records. We further highlight some challenges users might
- face when extracting species distribution data from Facebook and suggest potentialsolutions.
- 62 3. Following our proposed framework, we present a case study on Bangladesh's biodiversity
- 63 a tropical megadiverse South Asian country. We scraped nearly 45,000 unique locality
- 64 data for 967 species, with a median of 27 records per species. About 12% of the distribution
- 65 data were for threatened species, which represent 27% of all species. We also obtained data
- 66 for 56 Data Deficient species.
- 4. If carefully harvested, social media data can significantly reduce global biodiversity
- 68 knowledge gaps. Consequently, developing an automated tool to extract and interpret
- 69 social media biodiversity data is an essential research priority.
- 70

71 Introduction

- Amid the sixth mass extinction, many species worldwide are dramatically declining 28% of all assessed species in the IUCN Red List are threatened with extinction (Dirzo et al., 2014;
- Pimm et al., 2014; Murali et al., 2023). A recent study that analysed population trends for all
- 75 IUCN Red List assessments revealed that 48% of species are declining, 49% are in stable
- condition, and only 3% of assessed species are increasing (Finn et al., 2023). The Living
- 77 Planet Index report reveals an average 69% decrease in monitored wildlife populations since
- 1970 (WWF, 2022). However, global assessments are highly biased towards certain taxa or
- regions (Miqueleiz et al., 2020). For example, 85% of described reptile species have been
- assessed by the IUCN Red List (Meiri et al., 2023) vs ca. 1% of arthropod species (IUCN,
 2023). This severe discrepancy reflects a long-known bias in research interests (Clark & May,
- 2023). This severe discrepancy reflects a long-known bias in research interests (Clark & May,
 2002; Cardoso et al., 2011; Di Marco et al., 2017) and can be partially attributed to missing
- and inadequate distribution data that is fundamental for species threat assessments (Beck
- et al., 2014; Hughes et al., 2021). For example, a taxonomic revision and distribution sample
- of beetle species found that 53% of the 186 species were only known from a single locality,
- and 13% from a single specimen (Stork, 1997). These sorts of biases are known as Linnean
- 87 shortfalls (taxonomic knowledge gaps) and Wallacean shortfalls (distribution knowledge
- gaps; Hortal et al., 2015; Diniz-Filho et al., 2023). Such poor representation of species
- 89 records is also prominent in the most extensive biodiversity repository Global Biodiversity
- 90 Information Facility (GBIF) which contains locality data only for 10% of described insect
- 91 species (Chowdhury et al., 2023a).

92 To bridge this knowledge gap, many initiatives are using knowledge from the general public 93 (Hochkirch et al., 2015). These data collection initiatives are commonly known as citizen 94 science or community science, in which people share their species observation records 95 through different, often online, applications (Conrad & Hilchey, 2011; Bela et al., 2016; 96 Chandler et al., 2017; Pocock et al., 2019; Callaghan et al., 2021). These observations, in 97 many cases, are eventually deposited in large online repositories (e.g. GBIF; Roy et al., 2018; Callaghan et al., 2022). There are hundreds of such citizen science applications 98 globally that have greatly improved our understanding of biodiversity patterns in recent 99 100 years. Since 2007, there has been a 12-fold increase in biodiversity data in GBIF (Heberling 101 et al., 2021; GBIF contains > 2.3 billion species occurrence records as of 9 June 2023). However, despite increases in the volume of biodiversity data available, geographic and 102 103 taxonomic knowledge gaps on species distributions remain (Hughes et al., 2021). Most 104 biodiversity observation records are from Europe and North America, resulting in major 105 sampling and observation biases (Ramírez et al., 2022). While most species are found in 106 tropical forests, our knowledge of the biodiversity of these regions is extremely limited 107 (Collen et al., 2008; Hortal et al., 2015; Meyer et al., 2015; Hughes et al., 2021; Chowdhury et al., 2023b). Though it comprises less than 2% of the Earth's area, nearly 36% of the 108 biodiversity data in GBIF come from the United States. Conversely, Brazil, which has a 109 110 similar land area to the USA and is the most biodiverse country on Earth, is represented by only 0.8% of the records in GBIF (accessed on 22 May 2023). Therefore, new approaches 111 and methods are needed to overcome the Linnean and Wallacean shortfalls. 112

With the increasing popularity of social media and the growing availability of digital phones 113 and fast internet, many people post biodiversity observations on different social media 114 115 platforms (e.g., Facebook, Twitter; Di Minin et al., 2015; Andrachuk et al., 2019; Toivonen et al., 2019) that don't necessarily make it to the existing pipelines to GBIF. Among these 116 117 platforms, Facebook has become the most popular social media network (Anderson et al., 118 2012). There are thousands of biodiversity observation groups on Facebook globally, with a 119 wealth of species distribution information, often with more in-depth data than available in 120 global biodiversity repositories (Chowdhury et al., 2023b). For example, by scraping a single 121 Facebook group for the butterflies of Bangladesh, Chowdhury et al. (2021) obtained about 122 35 times more distribution records from Facebook than were deposited in GBIF at the time. 123 Moreover, Facebook also contains data regarding many unique species that are absent from 124 GBIF altogether (Chowdhury et al., 2023b). Such data have also been shown to be key for 125 improved spatial conservation prioritisation (Chowdhury et al., 2023c). The utility of Facebook as a biodiversity repository is possible due to volunteer contributions of 126 127 moderators and administrators of Facebook groups that help users identify species (Chowdhury et al., 2023b; Marceno et al., 2021). Moreover, many scientists are unaware of 128 129 the great biodiversity potential found in social media data or are unfamiliar with pipelines to

- 130 extract such data (Chowdhury et al., 2023c).
- 131 Several studies explored the importance of using Facebook data to fill the global biodiversity
- data shortfall (e.g., Chamberlain, 2018; Marcenò et al., 2021; Chowdhury et al., 2023b;
- 133 O'Neill et al., 2023). While having a standard data collection protocol is essential to improve
- 134 conservation assessments, there is no such protocol that researchers can follow to collate
- 135 species distribution data from Facebook. Here, we provide a complete pipeline to harvest
- 136 quality biodiversity data from Facebook groups, which were accessed by receiving
- 137 permission from the groups' administrators, for Bangladesh as a case study. We discuss i)

- 138 the keyword formulation process, ii) how to search inside Facebook groups and extract and
- 139 filter species photographs, and iii) how to georeference the location information. Finally, we
- 140 point out the potential of species distribution data obtained from Facebook and some
- 141 challenges that users might face when extracting species distribution data from Facebook.
- 142

143 Methods

144 Data extraction framework

Extracting species locality information from Facebook contains three steps: group selection,data extraction, and georeferencing the record location (Figure 1a).

147 Step 1 - Group selection

148 Before starting the data extraction process, it is important to filter the relevant groups using

a systematic search. Search keywords could contain a combination of taxon and country

- names. For example, if there is an interest in extracting data for 'birds' from 'Bangladesh',
- 151 the keywords can be: 'Bird Bangladesh'. Here, singular/plural form or capitalisation of words

do not make any substantial difference - except in their order of appearance. We

153 recommend using different combinations of keywords (including region names) when listing

relevant Facebook groups. After formulating keywords, the search can be conducted using

- 155 the Facebook search function to identify relevant groups (Figure 1).
- 156 Step 2 Data extraction
- 157 When extracting data, the authors should carefully consider the privacy of the group:
- 158 whether it is public, private or secret and maintain the data usage policy (Di Minin et al.,
- 159 2021). Authors should also prepare a complete list of species that need manual search.
- 160 When a relevant group is selected, the next step is to extract species information. This can

161 be performed by searching for species locality records inside individual groups. Searching

162 within Facebook groups is similar to searching in engines like Google Scholar: species names

- 163 can be searched with the search function of the selected Facebook group ('magnifying glass'
- icon inside the Facebook group), which includes options to restrict the search (e.g., year;
- 165 Figure 1).

166 During data extraction (from posts, but not photographs), some issues may be encountered. 167 For example: i) species misidentification in the caption, ii) inconsistencies with species 168 names (some users use the scientific name, while others use the English or local name), iii) 169 Facebook becomes too slow when the keyword searches produce too many search results, 170 and iv) search results also include erroneous species due to partial keyword overlap (e.g., butterfly named 'common pierrot' could appear when searching for 'common jay'). To 171 handle misidentification issues, we recommended double-checking species identifications 172 before extracting data. In active Facebook groups, moderators, administrators, or other 173 users often verify individual photographs and provide suggestions when required. This is 174 175 particularly relevant when they help users identify photographs and confirm locality 176 information. Such information can often be found in the comment section of each 177 photograph. To control naming inconsistencies, we recommend searching by scientific 178 name, English name, and local names for each species in each group. Another issue is that the same photographs might appear in different searches due to the partial keyword 179

- 180 overlap. To control this issue, researchers could use a unique identifier for the users and
- 181 then remove duplicate information. To expedite the search process during an individual
- 182 search, we recommend restricting the search by year using the 'Date Posted' tab on the left-
- 183 hand side of the screen. Here, individual years (e.g., 2021) can be filtered for each search,
- and then the process should be repeated until there are no further search results. Finally,
- 185 duplicate records can be removed.

186 Step 3 - Georeferencing

187 Facebook lacks an automated georeferencing system. Using the location information from

species photographs (Figure 1), any mapping software (e.g., Google Map, Google Earth,

189 ArcGIS) can be used to extract the latitude and longitude information. Conveniently, Google

- 190 Place ID API (https://developers.google.com/maps/documentation/places/web-
- 191 service/place-id) enables automatic georeferencing for many locations. It can also be done
- using the 'geocode' function of the 'ggmap' R package (Kahle and Wickham, 2013).
- 193

194 Case study on Bangladesh

195 Species list

196 To illustrate the application of our proposed framework, we performed a case study for 197 extracting biodiversity data from Bangladesh's dedicated Facebook groups. We compiled a checklist of the animals of Bangladesh with a known conservation status (1,619 species) 198 199 from the most recent national Red List (IUCN Bangladesh, 2015). While this is the most comprehensive checklist for the biodiversity of Bangladesh, the list is already eight years 200 201 old, and several other undocumented species remain. From the Red List database, we 202 extracted group names (e.g., Birds, Butterflies), Order, Family, scientific name, English 203 name, local name, and the Red List assessment status in Bangladesh. While cross-checking 204 the data, we noticed that the Family information for butterflies was old and did not match 205 the Family names found in GBIF. We updated family names following the GBIF taxonomy to 206 handle this issue. Specifically, we updated the information for four Families (Acraeidae, Amathusiidae, Danaidae, and Satyridae) and moved them under the Family Nymphalidae. 207 208 Finally, we removed regionally extinct species (assessed as RE in the national Red List) from 209 the species list.

210 Step 1 - Group selection

211 First, we searched for each taxonomic group (e.g., Bird) and added the country name 212 (Bangladesh) at the end (e.g., Bird Bangladesh). From our previous experiences, we were 213 aware that some Facebook groups contain the term 'biodiversity'. Consequently, we also 214 searched Facebook using the keywords 'biodiversity Bangladesh'. Altogether our search 215 keywords included the following seven combinations: 'Amphibian Bangladesh', 'Bird 216 Bangladesh', 'Butterfly Bangladesh', 'Crustacean Bangladesh', 'Fish Bangladesh', 'Mammal 217 Bangladesh', and 'Reptile Bangladesh'. Based on the search results, we filtered the most 218 popular Facebook groups, for each taxon, based on i) moderation activity (e.g., whether 219 group moderators help users with species identification), ii) group rules (if the group has 220 strict rules about the location and date of the photographs), and iii) group activities (if 221 members post every day).

222 Step 2 - Data extraction

- 223 We followed a range of approaches when extracting species distribution data from
- Facebook groups. Before starting the data extraction process, we conducted a test search
- 225 with some common and rare species. To control naming inconsistencies, we searched each
- 226 species with its scientific name, English name, and local name in Bengali, which led to three
- rounds of search for each species in each group. To expedite the search process, we
- restricted searches by year with the 'Date Posted' tab. Here, we filtered individual years
- (e.g., 2021) for each search and extracted all relevant results for that year. We repeated this
- 230 process until there were no more new search results. Finally, we removed duplicate records
- 231 from the compiled datasheet (see above).
- 232 From each post, we extracted the following information: species name (search keyword),
- life stage (e.g., adult, egg), date (day/month/year), location information, and the name of
- the photographer. For quality control, we double-checked if the species identification was
- correct before extracting its information. We also skimmed through the comments of
- individual photographs. We excluded photographs if i) the photograph was not from
- Bangladesh, ii) the photograph was unclear, iii) the species was not identified up to the
- species level, iv) the locality information was missing, and v) if the area of the location was 230 over 100 km²
- 239 over 100 km².
- 240 Step 3 Georeferencing
- As stated above, Facebook lacks an automated georeferencing system. Using the location
- 242 information from each post, we searched it in Google Map
- 243 (<u>https://www.google.com/maps</u>), selected a random point within that area, and extracted
- the latitude and longitude (in decimals). Considering that we discarded photographs if the
- specified location was an area over 100 km², the precision uncertainty of these extracted
- 246 distribution records was within 10 km.
- 247

248 Results

249 Data harvested from Bangladesh

- 250 Overall, we identified 42 Facebook groups for different animals in Bangladesh
- 251 (supplementary Table S1). While 15 of these groups are on birds, only one is on odonatans
- 252 (Figure 2). There are only four groups with > 50,000 members. Two groups are focused on
- 253 multiple taxa, one on birds and one on reptiles (Figure 2; supplementary Table S1).
- Of the 42 Facebook groups, we chose the seven most popular Facebook groups: Birds
- 255 Bangladesh (<u>https://www.facebook.com/groups/2403154788</u>); Deep Ecology And Snake
- 256 Rescue Foundation (<u>https://www.facebook.com/groups/959896627527624</u>); Biodiversity of
- 257 Bangladesh; (<u>https://www.facebook.com/groups/249240636186853</u>); Butterfly Bangladesh;
- 258 (https://www.facebook.com/groups/488719627817749); Mammals of Bangladesh;
- 259 (https://www.facebook.com/groups/647662968655338); Amphibians and Reptiles of
- 260 Bangladesh; (<u>https://www.facebook.com/groups/560709511527645</u>); Biodiversity of
- 261 Greater Kushtia (<u>https://www.facebook.com/groups/244807066739477</u>).
- We collated 44,726 occurrence records for 967 species, ranging between 1-719 records per
- species. These data included 45 amphibian species, 494 bird species, 265 butterfly species,

- 72 mammal species, and 91 reptile species (Figures 3A, 4). We could not locate any speciesoccurrence records for fishes or crustaceans.
- 266 While the median occurrence records per species were 27, it varied substantially amongst 267 taxa: the median species occurrence records were 54 for birds, 33 for butterflies, 5 for 268 mammals, and 3 for reptiles. There were 196 species with 80 or more records, of which only 269 seven were butterflies (no threatened species), and the rest were birds (one threatened 270 species, *Threskiornis melanocephalus*, Vulnerable). The following were the most popular
- species from each group: *Alcedo atthis* (birds, 719 records), *Danaus chrysippus* (butterflies,
- 272 107 records), *Prionailurus viverrinus* (mammals, 66 records), *Xenochrophis piscator* (reptiles,
 273 39 records), *Duttaphrynus melanostictus* and *Polypedates leucomystax* (amphibians, 14
- 274 records).
- 275 The number of occurrence records grew substantially with time, with some random
- fluctuations (Figure 3B). Although Facebook started in the early 2000s, we obtained many
- 277 records before that date. For birds, there were records available from 1978. For other taxa,
- the records started in 1992 for reptiles, 1998 for mammals, 2004 for butterflies and 2005 for
- amphibians. For all taxa, the number of species occurrence records increased markedly from
- the start date to early 2020; however, the numbers rapidly declined afterwards, possibly
- due to the COVID-19 pandemic (Figure 3B).
- 282 We obtained distribution data for 260 threatened species (27% of species), 651 non-
- threatened species (67% of species), and 56 Data Deficient species (6% of species) (see the
- supplementary Table S2). While 12% of the species distribution data was for threatened
- species, it varied substantially across taxa. For mammals, 70% of the occurrence records
- were for threatened species, 47% for butterflies, 14% for reptiles, 6% for amphibians, and
- 287 3% for birds (Figure 4A). The pattern was different when considering the proportion of
- species numbers within taxa recorded, both for threatened and non-threatened species. For
 butterflies, we obtained records for twice more species that were classed as threatened
- 290 (167) than non-threatened (84). For other groups, threatened species contributed to 46% of
- all mammal species, 20% for reptiles, 18% for amphibians, and 7% for birds (Figure 4B).
- 292

293 Discussion

294 The increasing number of citizen science applications are contributing to a sharp increase in 295 species distribution records (Heberling et al., 2021). However, despite this increase, a 296 substantial bias remains in our understanding of global biodiversity – the distribution of 297 tropical species remains overlooked (Hortal et al., 2015; Di Marco et al., 2017; Kühl et al., 298 2020; Hughes et al., 2021). Here, we present a standardised protocol for Facebook data 299 extraction, and we demonstrate its use on Facebook biodiversity records from Bangladesh, to assess how data obtained from this platform can help reduce the global bias in 300 301 biodiversity knowledge. We obtained nearly 45,000 records for 967 species from Bangladesh, of which 27% are nationally threatened, and many are Data Deficient. We 302 found that over time, data increased sharply for all taxa; however, there was a substantial 303 304 decline in the amount of data in 2021 during the COVID-19 pandemic. We further provide 305 step-by-step guidelines to extract species locality data, which could be helpful for future 306 researchers to obtain local and global biodiversity data that could aid in conservation 307 assessments.

308 Facebook data has the potential to improve our biodiversity knowledge. However, there are a few issues that users should consider (Di Minin et al., 2015; Toivonen et al., 2019; 309 Chowdhury et al., 2023b). First, extracting data from Facebook is a time-consuming and 310 multi-step process. On average, it took us nearly 33 minutes to complete the data extraction 311 312 process for a single species (i.e. ~532 hours in total). Second, Facebook photographs do not contain precise or automatic geolocation functions, which results in coordinate 313 314 uncertainties. Third, maintaining the quality of posts in Facebook groups requires active moderation activities, which include a high level of taxonomic expertise, and spending time 315 reviewing every photograph. While this is typical for Bangladesh, where administrators, 316 317 moderators, and users help maintain every photograph's quality, this might not be the case for many countries. We present a standardised protocol to extract biodiversity data from 318 319 Facebook. While automatic extraction is not (yet) possible, developing such tools to 320 expedite the process would be useful. Likewise, developing tools that automatically deposit 321 species distribution records from Facebook to the global biodiversity repositories could be 322 instrumental in harvesting this source for biodiversity records (Jarić et al., 2020; Correia et 323 al., 2021). If more resources are allocated for this endeavour, people can be appointed to 324 check Facebook posts regularly, help administrators and moderators maintain group quality, extract data regularly, and create a local database that will eventually be deposited into 325 326 global biodiversity repositories such as GBIF.

When using social media data for research purposes, inherent risks must be addressed to 327 328 protect individuals from potential harm, whether intentional or unintentional (Di Minin et al., 2021). To mitigate these risks and ensure the users' safety, it is important to adopt 329 330 practices such as data minimisation, anonymisation, and strict data management protocols. 331 Employing risk-based approaches, such as conducting data privacy impact assessments, can 332 aid in identifying and minimising privacy risks for social media users. Besides, when sharing 333 the observation records, authors should carefully consider whether they should share 334 threatened species' locations (Sbragaglia et al., 2021). This not only showcases 335 accountability but also ensures compliance with data protection laws, to safeguard the

- privacy of individuals involved in the research process (Di Minin et al., 2021).
- 337

338 Conclusion

339 While scientists worldwide are formulating innovative approaches to improve our 340 understanding of species distributions, there remain substantial taxonomic and regional gaps and biases. Several studies have shown Facebook's importance in extracting 341 342 biodiversity records (e.g., Chowdhury et al., 2021, 2023b,c); however, there is no standard pipeline that researchers can follow. Here, we provide detailed guidelines on preparing a list 343 of relevant Facebook groups and recommend approaches to search efficiently. While the 344 345 entire process still requires time, as we could not automate this yet, it is worth the effort, given we obtained thousands of species occurrence records for a tropical biodiverse 346 country, Bangladesh. We recommend a concerted effort to create a global database 347 containing biodiversity groups on Facebook. 348

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List of Figures

- 475 **Figure 1.** (A) The data extraction pipeline for obtaining species distribution records from
- 476 Facebook, and (B) the inclusion/exclusion criteria when filtering species photographs for477 different animal groups of Bangladesh.
- 478 **Figure 2.** The number and membership details of the available Facebook groups for
- Bangladeshi animals. Here, 'Herpetofauna' is 'Amphibians' and 'Reptiles', and we named
 'Multiple taxa' when the Facebook group was focused on > 2 taxa.
- 481 Figure 3. (A) The density (at 1 km²) and (B) yearly growth of species occurrence records,
- 482 obtained from Facebook for different animal groups of Bangladesh.
- 483 **Figure 4.** The relative proportion of threatened and non-threatened species in occurrence
- 484 records (A) and species records (B), obtained from Facebook for different animal groups in
- 485 Bangladesh, namely amphibians, birds, butterflies, mammals and reptiles. Here the black
- 486 dots represent the percentages of species that are nationally threatened.

487

489 **Figure 1.**

Step 1. Searching for Facebook groups

1. Search using keyword (e.g., Bird Bangladesh)



2. Refine search to 'Groups'

Search results



3. Select the relevant



Birds Bangladesh Public · 110K members

This group is for the birdwa people. We are here to sha Step 2. Data extraction



1. Search within the group by species name

Q oriental plover

Q oriental plover

2. Filter year by selecting 'Date Posted'

Any Date	
2023	
2022	
2021	
2020	
2019	

 Check the caption of the photograph and the comments section
 Check the inclusion/exclusion criteria
 Extract relevant information (e.g., species)

	Sultan Ahmed November 1, 2019 - @
ID con	firm - Oriental Plove

ID confirm - Oriental Plover (Charadrius veredus) A new bird for Bangladesh #703 Kuakata, Patuakhali 17 October, 2019



Step 3. Georeferencing the location



Go to Google Map (<u>https://maps.google.com/</u>)
 Search for the location

Kuakata, Bangladesh	Q	×

Click the cursor inside the area
 Extract the latitude and longitude





492 Figure 2.

494 Figure 3.

A) Distribution of species occurrence records



B) Annual number of of species occurrence records





496 Figure 4.