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Montgomery, G. A., Dunn, R., Fox, R., Jongejans, E., Leather, S. R., Saunders, M. E., Shortall, C. R., Tingley, M. W. and Wagner, D. L. 2019. Is the Insect Apocalypse upon us? How to Find Out. *Biological Conservation*. (22 November), p. 108327.

The publisher's version can be accessed at:

https://dx.doi.org/10.1016/j.biocon.2019.108327

The output can be accessed at: https://repository.rothamsted.ac.uk/item/96xyy/is-the-insect-apocalypse-upon-us-how-to-find-out.

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15/01/2020 12:37

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1 KEYWORDS: Insect declines, biodiversity crisis, biomass, monitoring, entomology

ABSTRACT

3 In recent decades, entomologists have documented alarming declines in occurrence, taxonomic richness, and geographic range of insects around the world. Additionally, some recent studies 4 5 have reported that insect abundance and biomass, often of common species, are rapidly 6 declining, which has led some to dub the phenomenon an "Insect Apocalypse". Recent reports 7 are sufficiently robust to justify immediate actions to protect insect biodiversity worldwide. We 8 caution, however, that we do not yet have the data to assess large-scale spatial patterns in the 9 severity of insect trends. Most documented collapses are from geographically restricted studies 10 and, alone, do not allow us to draw conclusions about insect declines on continental or global 11 scales, especially with regards to future projections of total insect biomass, abundance, and extinction. There are many challenges to understanding insect declines: only a small fraction of 12 13 insect species have had any substantial population monitoring, millions of species remain 14 unstudied, and most of the long-term population data for insects come from human-dominated landscapes in western and northern Europe. But there are still concrete steps we can take to 15 16 improve our understanding of potential declines. Here, we review the challenges scientists face in documenting insect population and diversity trends, including communicating their findings, 17 and recommend research approaches needed to address these challenges. 18

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INTRODUCTION

Declines of insect abundance, biomass, and range are being reported worldwide, from the arctic 22 to the tropics, across insect orders, and from a spectrum of ecological guilds (e.g., Fox 2013, 23 24 Hallmann et al. 2017, Loboda et al. 2018, Lister & Garcia 2018, and reviews by Sanchez-Bayo 25 & Wyckhuys 2019, Wagner 2017, 2019b). Though fewer than 100 insect species are documented as extinct (IUCN 2019), more recent extinctions have assuredly occurred on islands and 26 27 deforested tropical regions. One important aspect of many recent studies is the decline of 28 formerly common species, not just rare taxa (Conrad et al. 2006, Van Dyck et al. 2009, Fox et al. 29 2015), with the realization that such losses likely come with changes to ecosystem connectivity 30 and function (Gaston & Fuller 2007, Dirzo et al. 2014). Some studies have reported dramatic 31 declines: Hallmann et al. (2017) found a 75% decrease in flying-insect biomass over a threedecade period from 63 preserves in northwestern Germany. Declines are also reported from 32 33 many western and northern European countries, representing a suite of different insect orders (e.g., Conrad et al. 2006, Shortall et al. 2009, Schuch et al. 2012, Van Strien et al. 2019, 34 Hallmann et al. 2019; see also reviews by Sanchez-Bayo & Wyckhuys 2019, Wagner 2017, 35 36 2019b). Two of the studies that drew worldwide media attention (Lister & Garcia 2018, Sanchez-Bayo & Wyckhuys 2019) not only ignited discussion of insect declines among scientists and lay 37 people alike, but also received substantial criticism—their methods, results, and extrapolations 38 39 are much contested (Komonen et al. 2019, Mupepele et al. 2019, Simmons et al. 2019, Thomas

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et al. 2019, Wagner 2019a, Willig et al. 2019; see Saunders 2019 for a review of the datasets
 informing this discussion).

Many insect taxa are unequivocally in decline across many regions of the planet, and we know enough to take conservation action (Basset & Lamarre 2019, Janzen & Hallwachs 2019, Forister et al. 2019). However, important aspects of the insect decline phenomenon remain largely unknown. Most importantly, we need to understand how quickly populations are trending upward or downward. Annual declines of 1-2% for species in densely human-populated areas are unfortunate but relatively unsurprising, while >3% annual declines in areas far removed from most human activities would be stunning. Failure to make such distinctions can lead to untenable extrapolations, e.g., that 40% of the world's insects will be extinct in a few decades, as posited in Sanchez-Bayo & Wyckhuys (2019). Next, are the rates of population change of insects roughly on par with those of plants, birds, and mammals, as found generally by Dirzo et al. (2014)? If so, then the apocalypse is one suffered by all species. An answer to this question could also point to the drivers. If insects are declining at rates appreciably faster than vertebrates and plants in the same regions, it may be prudent to focus research on stressors like that especially impact insects (e.g., insecticide use), or it may be an indication of what is to come for other taxa. Finally, with so few data from outside Europe, it is difficult to gauge how widespread the phenomenon is, especially in the tropics (Basset & Lamarre 2019, Janzen & Hallwachs 2019), where more 85% of all insect species occur (Stork 2018), and in temperate regions of the southern hemisphere. Many studies show that there are winners as well as losers in recent insect biodiversity change (Brooks et al. 2012; Boyes et al 2019) and that net loss of insect abundance/biomass has not been reported from all study locations (Shortall et al. 2009; Valtonen et al. 2017; Herrera 2019). Overall, although progress is being made, attempts to answer questions regarding the magnitude, and in many cases even the existence, of insect declines face many challenges. Here, we outline these challenges, but focus on research recommendations, from increased monitoring, to community science and pleas for more rigorous methodologies and meta-analyses. We also touch on matters of unexplored data streams, reporting bias, and funding needs.

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CHALLENGES

- The Insect Side
- 70 The greatest challenge to studying insect population trends, be it declines in diversity,
- abundance, range, occurrence or other metrics, is the paucity of baseline data (Cardoso et al.
- 72 2011, Eisenhauer et al. 2019, Wagner 2017, 2019b, Cardoso & Leather 2019): we lack robust
- 73 records of past insect populations and diversity. Traditionally, entomological collections have
- been focused on documenting species diversity rather than abundance, often for a narrow range
- of taxa, and as such, yield little information about population numbers and survey effort,
- 76 rendering many historical collection events essentially non-replicable. The geographic
- distribution of haphazardly distributed baseline data is also a problem those data that do exist
- 78 come mostly from "anthroposcapes," or human-altered ecosystems. While these data are useful
- 79 for evaluating direct human effects on insects, they are not useful for drawing conclusions about

- 80 insect populations in areas with modest human activity and wildlands (Wagner 2019b). The
- 81 temporal distribution of available baseline datasets is also an issue. Many of the baseline data
- 82 that do exist post-date the onset of purported drivers of insect declines, for example, the UK
- 83 Butterfly Monitoring Scheme, a flagship long-term insect monitoring effort, began in 1976, after
- agricultural intensification was well underway (Pollard & Yates 1994).
- Additionally, large natural fluctuations in invertebrate populations from year to year, and
- sometimes even within a single year, make drawing conclusions from demographic studies of
- 87 insects challenging (Fox et al. 2019). This large interannual population variation is dependent on
- 88 many intrinsic and extrinsic factors (Hanski 1990), including myriad natural enemies (Turchin et
- al. 1999) and the vagaries of weather (Wolda 1983, Nelson et al. 2013). This is especially
- 90 problematic for the interpretation of "snapshot" surveys where population data from one period
- are compared with population data from another period, without data from intervening years
- 92 (Habel et al. 2019).
- 93 Entomologists and those reliant on sound insect identifications also face an enormous taxonomic
- 94 impediment (Samways 1993, Habel et al. 2019), especially in tropical regions. It is difficult to
- 95 know what we are losing when 80% of insect species (representing, conservatively, four million
- species) remain undescribed and their natural histories unknown (Stork 2018). High insect
- 97 species diversity compounds this problem; identification of every insect even in a small sample
- 98 in an area with low alpha diversity can be time- or cost-prohibitive. Declines in insect
- 99 identification expertise further degrade the ability to determine biodiversity and population
- trends for most insect lineages (Hopkins & Freckleton 2002); growing sources of identification
- knowledge through community science, machine learning, and genetic barcoding are helpful, but
- cannot compensate the continuing loss of professional taxonomist expertise. Using indicator taxa
- can be an effective approach to sidestep aspects of the taxonomic impediment problem but doing
- so often results in inadequate knowledge and compromised measures of interest (McGeoch 1998,
- 105 Thomas 2005).
- There are many consequences of this shortfall of insect biodiversity knowledge, when combined
- with a general lack of baseline population data. One illustration can be seen in the number of
- insects with global conservation statuses evaluated by the International Union for Conservation
- of Nature: only 8,355 insect species have been evaluated, and 2,104 of those are "data deficient"
- 110 (IUCN 2019), out of an estimated 5.5 million insect species worldwide (Stork 2018).
- 111 The Human Side
- Scientific, public and political interest in insect population declines and conservation is
- encouraging and has led to new research programs, redoubled interest in sampling
- methodologies, catalyzed interest in analyses of historical data sets, led to biodiversity-friendly
- government initiatives, and increased funding for the study of insects. Several high-profile
- studies finding large declines in insect populations or biomass have spurred massive media
- attention and generated unprecedented public interest in insects and their ecosystem services.
- 118 Unfortunately, some media reports of insect declines have made extrapolations that have leapt
- beyond credible evidence, though there are examples of more balanced coverage (e.g., Yong

- 2019). Exaggerated claims can sometimes trigger complex feedback loops between scientists,
- institutions, media and the public (Ransohoff & Ransohoff 2001, Bubela 2006, Caulfield &
- 122 Condit 2012). To avoid such claims from being made, it is incumbent upon scientists to continue
- presenting thoughtful, critical assessments; the risks of false positives are high. Because global
- insect populations have such importance, and also because of the enormous data gaps and
- potential biases, it is especially important to commit to elevated standards of study design,
- evidence, and communication.
- Human psychology also poses challenges for understanding the insect decline phenomenon, and
- we should be aware of human tendencies that affect this field. For example, humans tend to view
- insects as one homogeneous group, which masks the complex and variable effects occurring
- across taxa and guilds (Habel et al. 2019). Older people recall seeing more moths in headlights
- 131 ("the moth snowstorm"), summer nights filled with fireflies, and splatted insects on their
- windshields. Such anecdotes are valuable, but only rarely can be substantiated. On the other
- hand, younger people may not notice what has been lost as a result of shifting baseline syndrome
- 134 (Pauly 1995, Soga & Gaston 2018). However, it is also true that a generational shift in where
- people live has also occurred, with broad shifts toward cities and hence the experience of the
- subset of species that thrive in cities. Confirmation bias, the tendency to interpret data to support
- existing hypotheses (Nickerson 1988), could creep into experimental design and analyses,
- especially in ecological studies where many effects interact weakly. Publication bias is also no
- doubt at play, where statistically significant results are selected for publication more often than
- studies with non-significant results (Rosenthal 1979). How large a problem might it be that
- studies documenting losses are more likely to be written, reviewed, and accepted for publication
- than studies showing little change? Indeed, studies of insects in general are less likely to be
- published than studies of other taxonomic groups (Leather 2009), another form of publication
- bias. There is also a tendency for the most extreme results to be published and cited (Ioannidis
- 145 2005) this may be especially relevant for a topical issue like insect declines. While most
- scientists are already aware of these issues, it is important to regularly remind ourselves of them.

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RESEARCH RECOMMENDATIONS

- Determining the scale and severity of declines in insect diversity, abundance, and range must be
- among the most urgent global research, conservation, and legislative priorities going forward.
- But what research will be most effective? Entomologists have unique opportunities in this
- moment of heightened public awareness.
- 153 Monitoring
- 154 First, we need to establish insect monitoring networks on a global scale. By using repeatable
- sampling methods, new monitoring programs can augment pre-existing ones, and help determine
- population trends, identify drivers of trends, and serve to engage the public through community
- science (Lewandowski & Oberhauser 2017). We advocate for large-scale programs to monitor
- abundances, biomass, and species diversity using standardized, effort-based methods such as
- Malaise trapping, pitfall trapping, suction trapping, light trapping, count surveying, and new

- methods such as the modified window traps of Knuff et al. (2019) or smart insect cameras
- 161 (Hogeweg et al. 2019). Although biomass is an imperfect estimator of diversity because it can be
- sensitive to changes in abundances of large species (e.g., Shortall et al. 2009), it is a valuable
- metric from the ecosystem perspective. Determining biomass trends also does not require fine-
- scale taxonomic knowledge, which is often limited to individuals with specialized training. We
- advocate this approach with necessary caveats; it is often impractical to attempt monitoring all
- insect species from any community with appreciable diversity (though meta-barcoding and other
- genetic approaches can help).
- Long-term monitoring should consider the relative economic and ecological costs and benefits;
- although regular lethal trapping may not have major impacts on insect communities (Gezon et al.
- 2015), the economic costs of sampling and identification of large volumes of many taxa may be
- prohibitive (Tepedino et al. 2015; Drinkwater et al. 2019). Better-known taxa like butterflies,
- macromoths, orthopterans, and some bees and beetles can serve as indicator or substitute species
- for other insect groups, but only when carefully validated (Henry et al. 2019).
- 174 Effective long-term monitoring takes many forms, including complex spatial designs with many
- observers and single-observer designs with temporally intensive data from fewer sites (Pocock et
- al. 2015). Continuous, or at least multi-year, time-series are especially valuable for insects,
- where year-to-year population variation can be high. Although longitudinal time-series (e.g.,
- Wepprich et al. 2019) provide better inferential power, "snapshot" surveys are useful for taxa or
- 179 regions limited by a lack of continuous historical data, if scientists control for variation in effort
- and changes in methods whether through strong data filtering or direct statistical modeling
- 181 (Tingley 2017) and can replicate previously conducted surveys on a broad geographic scale.
- Though existing long-term monitoring programs are relatively rare, programs that do exist
- provide invaluable data and can be used as models for new monitoring efforts. A non-exhaustive
- list of such programs include the Wijster Biological Station pitfall program (NL; Den Boer &
- van Dijk 1994), the Rothamsted Insect Survey (UK; Storkey et al. 2016), the Krefield
- Entomological Society surveys (DE; Hallmann et al. 2017), the United Kingdom, Dutch &
- 187 Catalan Butterfly Monitoring Schemes (UK; Pollard & Yates 1994, NL; Van Swaay et al. 1997,
- ES; Melero et al. 2016), midwestern butterfly surveys (US; Swengel et al. 2011, Wepprich et al.
- 2019), and the Shapiro butterfly surveys (US; Forister et al. 2011). Collectively, these programs
- 190 form the basis for a large part of what we know about long-term diversity and population trends
- in insects the next step is expanding and complementing these schemes on a global scale, while
- 192 continuing to support existing programs.
- 193 Surveying across space
- Surveys across light pollution, agricultural intensification, pesticide use, plant invasion, urban
- heat island, human density, or other gradients could provide insight into what factors are
- contributing to insect declines and their relative importance. There is an urgent need to gather
- demographic data from tropical sites—while not wholly surprising, it is ironic that we know the
- least about the Earth's most species rich and ecologically diverse entomofaunas (Stork 2018). In
- addition, surveys that substitute space for time can serve as an imperfect substitute for baseline
- data. This survey strategy is commonly used in ecology when time-series data are lacking (Blois

- et al. 2013) and can prove particularly powerful when tested against experimental data and, for
- the subset of sites for which they are available, time-series data (Lahr et al. 2018).
- 203 Making time-series data available
- We also need to make baseline data more open and accessible. Continuous or nearly continuous
- 205 time-series of insect abundance and diversity have been collected by observers outside of insect
- 206 conservation and ecology circles. For example, changes in lady beetle populations have been
- 207 monitored using control plots at experimental farms (Alyokhin & Sewell 2004). Vertebrate
- 208 ecologists studying insectivores that also collect insect (prey) abundance data have the potential
- to contribute much to our knowledge of insect population trends (e.g., Harris et al. 2019).
- 210 Data collected by agricultural and silvicultural monitoring, land-management agencies, insect
- collectors, and nature enthusiasts can all be useful. These datasets, like datasets from traditional
- 212 ecological sources, should be made available and posted to online repositories like Dryad
- 213 (datadryad.org), BioTIME (biotime.st-andrews.ac.uk; Dornelas et al. 2018), or the Global
- 214 Biodiversity Information Facility (gbif.org) when possible. We recognize that there are social
- and financial barriers to contributing data sets to online repositories that still need to be
- addressed, and care needs to be taken to protect the intellectual property rights of ongoing long-
- term surveys to ensure their continuity (Pearce-Higgins et al. 2018).
- 218 Community science
- 219 Some of the best long-term monitoring data comes from community or citizen scientists. The
- biomass declines reported by Hallmann et. al. (2017) in Germany are based on the work of the
- 221 Krefield Entomological Society, an organization of knowledgeable entomologists, most of which
- 222 commit their free time to insect research. Beyond already existing community science efforts, the
- 223 current moment is also an opportunity to reach new audiences with a message of insect
- conservation on a global scale (see Pocock et al. 2018). Concerned community scientists can be
- recruited to re-sample "snapshot" surveys on a large geographic scale. Similarly, enlisting school
- classrooms to participate in insect monitoring can provide useful data (e.g., the School Malaise
- Trap Program in Canada: Steinke et al. 2017, and Saunders et al. 2018). Live pitfall and LED
- 228 UV-light traps are inexpensive to set up and monitor and can mitigate ethical concerns
- sometimes associated with specimen collecting, especially by the public. Taxa such as
- caterpillars, larger beetles, and wasps can be imaged (and identified) with cell phones, offering
- 231 myriad possibilities. School monitoring programs also have the potential to be expanded to larger
- 232 geographic scales.
- 233 Such community science efforts simultaneously serve to educate, raise awareness about the
- 234 importance of insects, and provide opportunities for invertebrate conservation (Lewandowski &
- Oberhauser 2017). Error and bias due to variation in the expertise of the participants is a
- recognized issue (Gardiner et al. 2012) and designing protocols that account for or minimize this
- is important (see Dennis et al. 2017); training projects such as BioLinks
- 238 (https://www.fscbiodiversity.uk/projects/biolinks) can play invaluable roles. There are many
- 239 successful insect-related community science projects that collect useful data on insect
- abundance, diversity, or distribution that can serve as models. Examples include The Monarch

- 241 Larva Monitoring Project, National Moth Recording Scheme, Caterpillars Count, Bumble Bee
- Watch, Lost Lady Bug Project, Firefly Watch, Wild Bee Garden Count, Western Monarch
- 243 Thanksgiving Count, Australia's Wild Pollinator Count, UK Pollinator Monitoring Scheme,
- iNaturalist.org, and BugGuide.net.
- 245 Reporting and synthesizing results
- Once insect trend data have been collected, they need to be shared, and well-designed insect
- 247 demography studies should be published or otherwise made available. To combat publication
- bias, researchers, reviewers, and journal editors alike need to publish reports of increasing and
- stable trends, in addition to documenting declines. Reports of where insects are not declining are
- as important as reports of where they are declining, since this heterogeneity can help elucidate
- 251 key threats. Unbiased reporting will also reduce systematic biases in the literature, which is
- 252 helpful for researchers performing systematic reviews and meta-analyses. These forms of
- evidence synthesis can effectively provide a means of evaluating the scale and severity of insect
- declines and their potential drivers when they follow question formulation tools like PICO
- 255 (Richardson et al. 1995) and reporting guidelines like ROSES (Haddaway et al. 2018). We
- recommend projects such as the EntoGEM systematic mapping project (Grames et al. 2019;
- 257 https://entogem.github.io), a community-driven effort to assimilate global literature and data sets
- relevant to insect population and diversity trends.
- 259 *Under-exploited datasets*
- Beyond these steps, however, complementary approaches are needed to fully evaluate the
- mechanisms, pattern, and consequences of insect declines, especially to provide alternative
- baseline data. For example, NEXRAD is a network of weather radars in the United States that
- are used to monitor birds (Dokter et al. 2018); data from these radars could also provide
- estimates of aerial insect biomass flows over the last 25 years (Hu et al. 2016). The use of
- museum collections to estimate insect trends (e.g., Cameron et al. 2011, Bartomeus et al. 2013,
- Boyle et al. 2019) is becoming more powerful with new statistical methods. Caution is required
- 267 when using data that were not collected for this purpose (e.g., see Wepprich 2019), including
- spatiotemporal bias (Ries et al. 2019), and abundance trends do not always correlate positively
- with occurrence (range) data (Dennis et al. 2019). However, museum collections can be used to
- infer trends and drivers of trends (e.g., Scheper et al. 2014, Meineke et al. 2019), and effort data
- can sometimes be extracted from species-list length in a time or place (Van Strien et al. 2013).
- 272 Continued digitization efforts (e.g., iDigBio, LepNet, SCAN) are necessary to bring collection
- data to bear on the issue of insect declines, since current numbers of digitized specimens are not
- enough to draw conclusions about trends in many cases (Ries et al. 2019). Stored samples from
- 275 monitoring projects are also available and have been utilized to some extent (Shortall et al. 2009,
- 276 Hallmann et al. 2017) most are available for further work. In some cases, data for
- insectivorous taxa may exist where baseline data for insects do not, perhaps allowing inferences
- about insect diversity and population levels (English et al. 2018, Wagner 2019b). Such
- insectivorous taxa can also provide insect data directly, through DNA sequencing diet samples or
- feces (e.g., Krauel et al. 2018). Entomologists should also think broadly and creatively about
- 281 new technologies and "Big Data" streams that could be used to study insects, from passive

282 283	acoustic monitoring (Zilli et al. 2014), smart insect cameras, and eDNA (Mächler et al. 2014) to LIDAR (Simonson et al. 2014), and social media (Alvaro et al. 2015).
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285	FUNDING
286 287 288 289 290 291 292 293 294 295 296	Few of these research priorities will be feasible without funding. There needs to be a recognition by research funding agencies, foundations, and individuals that entomological survey and monitoring work should receive a step-change in funding. Funding should more closely reflect abundance, diversity, and ecological importance of taxa, not their perceived charisma (Clark & May 2002). Crowdsourcing may draw in some funds, but what is required is stable, substantial funding that will allow existing and future international collaborations to flourish. For this to happen, we need to convince funders, and society, to support insect conservation as much as insect control. Long-term monitoring studies can be unappealing to funders and yet are the main lens through which we understand the rapid changes in biological systems; in this way they are akin to public health surveillance, essential and yet radically underfunded compared to studies of medical interventions.
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298	CONCLUSION
299 300 301 302 303 304 305 306 307 308	Insects are in trouble, and we must take conservation actions now, rather than wait for biologists to provide exhaustive demographic data, measure all drivers, and attempt to quantify population trends across thousands of individual lineages. But the many data gaps presently in the insect decline literature do matter, and it remains to be seen if some recent alarming results are indicative of global-scale insect declines that would trigger losses of ecosystem function. The drivers of declines are many, from habitat loss, agricultural intensification, and climate change, to invasive species, pesticides, and light pollution, but much remains unknown, including the scope and severity of insect declines. Despite the challenges faced by researchers studying trends in insect diversity and demography, it is urgent that we fill these crucial data gaps and use rigorous science to do so. It is time to get to work.
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