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8 **Power of the People: A Review of Citizen Science Programs for Conservation**

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14 **Highlights**

- 15 • Consistent definitions, protocols are needed to improve the citizen science field
- 16 • Citizen science provides benefits to participants, scientists, society, environment
- 17 • Challenges relate to economics, volunteer management, data analysis
- 18 • Experimental design, data management, data sharing are key areas to plan carefully
- 19 • Best practices for developing and running projects are discussed
20

21 **Abstract**

22 Citizen science is a rapidly growing field whereby volunteers can collect and/or analyze data to
23 contribute to research and gain an appreciation for the environment. There are countless
24 programs currently underway around the world: some have clear scientific hypotheses being
25 tested and others are simple data gathering; some are designed and led at the grass-roots level
26 while others are done by academics. This review focusses on best practices for the development
27 and running of citizen science projects to make them successful. It includes discussion around
28 different methods of experimental design, data collection, and analyses; how participants are
29 recruited, engaged, and rewarded (including who participates and why); the effect of
30 participation on the volunteer's knowledge and actions; and the impact programs have on policy
31 and other conservation actions. While there are several challenges that projects face, and more
32 research is needed in various areas, the many benefits support the continued expansion of citizen
33 science projects.
34

35 **Keywords**

36 Citizen science; community science; volunteer management; experimental design; naturalist;
37 citizen scientist
38

39 **1. Introduction**

40 While humans have been sharing observations of the world around them for millennia (Miller-
41 Rushing et al., 2012; Pastor, 2018; Silvertown, 2009), the domain of citizen science is a
42 relatively new area of research and discovery. Dating to the early 1990s (Follett and Strezov,
43 2015; Hannibal, 2016; Irwin, 1995), citizen science is a fast-growing field covering a wide range

44 of topics and taxa, from human microbiota (del Savio et al., 2016) to distant galaxies (Edwards
45 and Gaber, 2014). As a newer science that is being practiced globally in different forms, with
46 different definitions, frameworks, and protocols, it has not yet settled into a cohesive whole. Yet
47 to fully realize the potential of citizen science, it is necessary to identify what works well and
48 what does not, and where more research is needed to develop new techniques.

49
50 Although still young, the field of citizen science has received review articles on a wide variety of
51 subjects. For example, new technologies (Ceccaroni et al., 2019; Newman et al., 2012), methods
52 of data analysis (Cooper et al., 2012; Steve Kelling et al., 2015; Zipkin and Saunders, 2018),
53 assessments of data credibility and quality (Aceves-Bueno et al., 2017; Freitag et al., 2016;
54 Kosmala et al., 2016), impacts on policy (Greenwood, 2012; Hecker et al., 2019, 2018),
55 economic implications (Sauermann and Franzoni, 2015; Theobald et al., 2015) and impacts on
56 and by volunteers (Bell et al., 2008; Firehock and West, 1995; Lewandowski and Specht, 2015;
57 NAESM, 2018; Schuttler et al., 2018; Shirk et al., 2012) and on and by stakeholders (Sterling et
58 al., 2017). Additionally, there have been several reviews on the impacts of citizen science on
59 conservation efforts (Ballard et al., 2017; Chandler et al., 2016; McKinley et al., 2017; Newman
60 et al., 2017; Poisson et al., 2020; Silvertown et al., 2013). Other reviews have been conducted on
61 additional aspects of citizen science programs (Aceves-Bueno et al., 2017; Conrad and Hilchey,
62 2011; Danielson et al., 2014; Pocock et al., 2015; Sullivan et al., 2017, 2009; Wiggins and
63 Crowston, 2011).

64
65 Governments, universities, and non-profit organizations are now coming together to support the
66 development of common frameworks and guides (Blaney et al., 2016; Bonney et al., 2009a;
67 Citizen Science Association, 2020; CitizenScience.gov, 2020; NEIWPC, 2016; Societize
68 Consortium, 2013; Strasser et al., 2012; Tweddle et al., 2012; Wiggins et al., 2013). To
69 maximize project resources, common challenges should be noted and avoided or addressed.

70
71 This paper provides an expanded, cohesive overview of what citizen science is, who it involves,
72 and the reasons to use it. It covers small, in-person projects to large, online ones. It focusses on
73 best practices for developing and running citizen science projects through the identification of
74 common challenges faced and solutions to them, and includes suggestions on how to make
75 projects more successful. These include areas such as experimental design, data analysis and
76 quality control; volunteer recruitment, training, and retention; motivations for and effects of
77 participation; data management and security; data sharing and project overlap; obtaining funding
78 and other resources; economic, social and political controversies; project assessment and
79 evaluation; and new technologies.

80

81 2. Methods

82 To locate relevant sources, searches were conducted through Google Scholar using key words
83 such as “citizen science” and “community science” with additional qualifiers including
84 “challenges”, “techniques”, “review” and “research”. The titles and abstracts of the resultant
85 papers were read and evaluated and if they appeared relevant, the paper was given a deeper
86 review. Relevant references cited within this first group of papers were then obtained, and their
87 content and references evaluated, with more papers being targeted for review. This process was
88 ongoing, with the main searches occurring from January to June 2018. Additional searches were

89 also conducted via Google Scholar and institutional libraries during the writing of this article to
 90 locate information on specific topics not adequately captured using those original search terms.
 91

92 3. Results and Discussion

93 Using the snowball approach described above, over 300 papers were selected for a deeper
 94 review. These included original research through review articles, on scales from local city or
 95 regional based studies through national and international ones. While most of the research was
 96 based in North America and Western Europe, others were from Africa, Asia, South America, and
 97 other parts of Europe. Many were focused on ecological topics, from systems to species, and
 98 covered a range of taxonomic groups, from insects to mammals and plants. Projects were
 99 generally led by professional scientists, but citizen scientists also contributed to project design in
 100 some cases.

101 3.1 What is citizen science?

102 3.1.1 Definition

103 There is no consistent definition for citizen science (Auerbach et al., 2019; Eitzel et al., 2017;
 104 Heigl et al., 2019; McKinley et al., 2017; NASEM, 2018), although a spectrum of concepts and
 105 terminologies exists (Table 1). It commonly refers to a scientific program, overseen by
 106 professional scientists, where non-professional volunteers collect and/or analyse data that are
 107 then used to advance scientific knowledge (Auerbach et al., 2019; Eitzel et al., 2017; Heigl et al.,
 108 2019; McKinley et al., 2017; NASEM, 2018). These projects can provide baseline or monitoring
 109 data, answer research questions, increase stewardship and awareness, and influence conservation
 110 actions and policies (Acorn, 2017; Bonney et al., 2009b; Conrad and Hilchey, 2011; Follett and
 111 Strezov, 2015; Jordan et al., 2016; Le Féon et al., 2016; McKinley et al., 2017; Ryan et al., 2018;
 112 Thomas, 2016; Wiggins and Crowston, 2011).

113
 114 Citizen science may include certain types of games (Kawrykow et al., 2012; Khatib et al., 2011;
 115 Ponti et al., 2018) although some authors disagree as the players do not always understand the
 116 science behind the game (NASEM, 2018; Ponti et al., 2018). In Europe, the term can also relate
 117 to engaging the public in science discussions and policy making (Irwin, 1995). Projects that are
 118 focussed on public relations or science/environmental education (Russell, 2014), or that do not
 119 produce or share new knowledge (Acorn, 2017; Ballard et al., 2017; Miller-Rushing et al., 2012;
 120 NASEM - National Academies of Sciences Engineering and Medicine, 2018), do not fall into the
 121 definition of citizen science that is used here.

122

123 Table 1. Other terminologies used for citizen science.

124

Term	Reference
Community science	Conrad and Hilchey, 2011
Community-based management	Conrad and Hilchey, 2011
Community-based monitoring	Conrad and Hilchey, 2011
Community and citizen science	Ballard et al., 2017
Crowd-sourcing*	Eitzel et al., 2017 (but see e.g. McKinley et al., 2017)
Participatory monitoring networks	Bell et al., 2008

Participatory research	Hannibal, 2016
Public participation in organized research efforts	Dickinson and Bonney, 2012
Public participation in scientific research	Shirk et al., 2012
Voluntary biological monitoring	Conrad and Hilchey, 2011

125 *Some authors explicitly include crowd sourcing in with citizen science, where the term involves
 126 large numbers of volunteers collecting data often with small specific tasks to accomplish. Others
 127 do not include crowd sourcing, where participants are only involved in basic data processing and
 128 analysis with no connection to the underlying science.

129
 130

131 3.1.2 Topics covered by Citizen Science projects

132 Many projects involve a natural science topic (see broad discussions in e.g. Griffin Burns and
 133 Harasimowicz, 2012; Hannibal, 2016; Russell, 2014; Theobald et al. 2015), ranging from
 134 aligning DNA sequences (Kawrykow et al., 2012) and folding proteins (Khatib et al., 2011) to
 135 capturing information on a single taxa (e.g. Sullivan et al. 2017) or all taxa (e.g. van Horn et al.
 136 2018). Other projects are found in medical fields, informational sciences, and traffic
 137 management (Den Broeder et al., 2018; Follett and Strezov, 2015; Gonzalez et al., 2011; Shirk et
 138 al., 2012; Wiggins and Crowston, 2011).

139

140 3.1.3 Classifications of Citizen Science projects

141 Projects can be classified according to the level of participant involvement or the focus of
 142 project. Participants may only collect data or may be involved in the whole process of devising
 143 questions, collecting data, conducting analyses, and sharing results (Conrad and Hilchey, 2011;
 144 Gonzalez et al., 2011; Irwin, 2018; McKinley et al., 2017; Miller-Rushing et al., 2012; NASEM,
 145 2018; Silvertown et al., 2013). Bonney et al. (2009a) defined three categories of citizen science
 146 based on the level of participation: contributory, collaborative, and co-created. Shirk et al. (2012)
 147 defined five models also based on this: contractual, contributory, collaborative, co-created, and
 148 collegial. Lawrence (2006) in (Conrad and Hilchey, 2011) organized participation into four
 149 forms: consultative, functional, collaborative, and transformative. The definitions for many of
 150 these are similar and overlap, but there can also be differences, so it is important to establish the
 151 meaning of these terms in publications or when comparing projects.

152

153 Wiggins and Crowston (2011) identified five categories which relate to the type of project:
 154 socio-political action on local environmental issues; conservation projects, stewardship, and
 155 monitoring; real-world scientific investigation of particular questions; virtual scientific
 156 investigation of particular questions; and education and outreach. Bell et al. (2008) present the
 157 four categories proposed by McKelvey (1975), which relate to the type of organization:
 158 participatory environmental tourism; virtual network organisations; national non-governmental
 159 organisations; and local associations (Bell et al., 2008). Silvertown (2009) proposed categories of
 160 hypothesis-driven research, volunteer mapping and monitoring, and tools, guidance, and
 161 resources. Follet and Strezov (2015) initially divided projects into contributory, collaborative,
 162 and co-created, and then divided them based on their stated goals, including action, conservation,
 163 investigation, virtual and education.

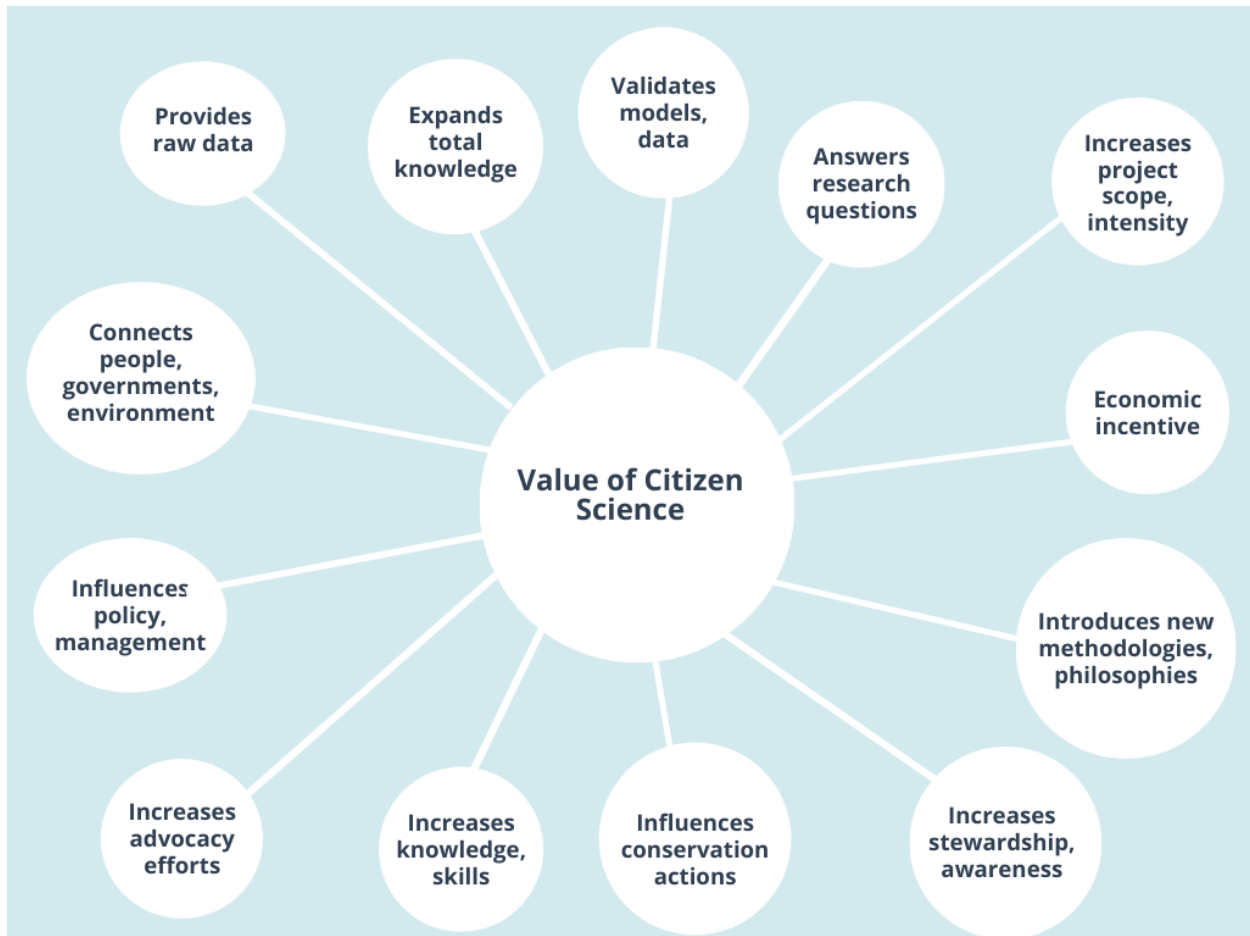
164

165 There are pros and cons to all of these classifications, and no one is better overall than another
 166 (Conrad and Hilchey, 2011; Shirk et al., 2012). Certain styles of projects may suit some project

167 types or scales better than others. For example, consultative and functional styles work better in
 168 large-scale projects that are “top-down” directed, while collaborative and transformative projects
 169 work better at smaller scales that are often “bottom-up” directed (Conrad and Hilchey, 2011;
 170 Shirk et al., 2012).
 171

172 3.2 Why have citizen science?

173 There are many benefits of citizen science to science, participants, policy and management. They
 174 are summarized in Figure 1 and discussed below.
 175



176
 177 Figure 1. Example values of citizen science.
 178

179 3.2.1 Value to Science

180 Citizen science programs can provide ecological data, answer research questions, increase
 181 learning, stewardship and awareness, introduce new epistemologies, and influence conservation
 182 actions and policies (Conrad and Hilchey, 2011; Follett and Strezov, 2015; Gonzalez et al., 2011;
 183 Irwin, 2018; Jordan et al., 2016; McKinley et al., 2017; NASEM, 2018; Peters et al., 2017;
 184 Reynolds et al., 2017; Thomas, 2016; Wiggins and Crowston, 2011). In particular, they help
 185 answer questions related to the abundance, distribution, behaviour, and changes in species,
 186 habitats, and ecosystems (including agricultural systems)(Aceves-Bueno et al., 2017; Acorn,
 187 2017; Eaton et al., 2017; Ryan et al., 2018; Sullivan et al., 2017).

188
189 This power comes as volunteers can increase the temporal and spatial scope and intensity of a
190 project, often beyond anything professional scientists could accomplish alone (Acorn, 2017; Bell
191 et al., 2008; Conrad and Hilchey, 2011; Cooper et al., 2012; Danielson et al., 2014; Hoyer et al.,
192 2012; Miller-Rushing et al., 2012; Parker and Thomson, 2018; van der Wal et al., 2015). These
193 data can be of high quality, similar to or identical to that collected by experts (Danielson et al.,
194 2014; Hoyer et al., 2012; Starr et al., 2014; Thomas, 2016; Trautmann et al., 2012; van der Velde
195 et al., 2017), although it depends on the program design and level of skills needed (Acorn, 2017;
196 Jordan et al., 2012; Kremen et al., 2011; Trautmann et al., 2012).

197
198 Citizen science data can be added to professional data to fill in gaps and/or expand total
199 knowledge (Bonter et al., 2012; Gonsamo et al., 2013; MacPhail et al., 2019; Silvertown et al.,
200 2013; Soroye et al., 2018; Zapponi et al., 2017; Zuckerberg and McGarigal, 2012). It can be used
201 to validate models (Gonsamo et al., 2013; Pimm et al., 2014) and ground-truth remote sensing
202 data (Cooper et al., 2012; Hannibal, 2016; Pimm et al., 2014). Other projects are concerned with
203 issues of economic, social, and environmental importance (Conrad and Hilchey, 2011; Gonzalez
204 et al., 2011). Other data sets (e.g. environmental, demographic) can be combined with citizen
205 science data to further explore trends and answer questions (Acorn, 2017; Hames et al., 2012).

206
207 Projects have the potential to answer questions from changes in range and climate (Bonney and
208 Dickinson, 2012; Bonter et al., 2012; Cooper et al., 2012; Gonsamo et al., 2013; Miller-Rushing
209 et al., 2012; Sullivan et al., 2017) to habitat loss and landscape level analyses (Dickinson and
210 Bonney, 2012; Miller-Rushing et al., 2012; Zuckerberg and McGarigal, 2012) and evaluation of
211 ecosystem goods and services (Birkin and Goulson, 2015). They can track changes in
212 populations over time, including declines of rare species and spread of invasive ones (Acorn,
213 2017; Dickinson et al., 2012; MacPhail et al., 2019; McKinley et al., 2017; Soroye et al., 2018;
214 Sullivan et al., 2017; Zapponi et al., 2017), as well as migration rates or impacts of predators,
215 disease, pollution, infrastructure, effects of livestock, environmental events, and other human
216 activities (Acorn, 2017; Bonney et al., 2014; Bonter et al., 2012; Conrad and Hilchey, 2011;
217 Cooper et al., 2012; Danielson et al., 2014; Eaton et al., 2017; Greenwood, 2012; Tidball and
218 Krasny, 2012).

219
220 Studies can be designed to replicate historic research to evaluate changes over time (Miller-
221 Rushing et al., 2012; Worthington et al., 2012) or provide necessary monitoring to back up
222 claims or evaluate actions (Danielson et al., 2014). They can act as a “crisis response network”
223 (Hannibal, 2016), reacting quickly to monitor changes (e.g. in water or air quality, distribution of
224 pathogens or invasive species) (Bonney et al., 2014; Cooper et al., 2012; Hannibal, 2016; Shirk
225 et al., 2012), while also connecting local people to each other, governments, and the
226 environment, and helping them recover their own livelihoods and landscapes (Dickinson and
227 Bonney, 2012; Owen and Parker, 2019; Tidball and Krasny, 2012).

228
229 New technologies provide options to the traditional approach of in-person observations or
230 collections that are shared on paper. For example, images, videos, and other data (e.g. radiation
231 counts) can be obtained by individuals via data loggers, tablets, smartphones, wildlife cameras,
232 satellites, telescopes, and drones and shared over the internet (Acorn, 2017; Austen et al., 2018;
233 Bonney et al., 2014; Eaton et al., 2017; Frigerio et al., 2018; Odenwald, 2019). Data processing

234 can be done by humans and computers, with new techniques evolving all the time (Ceccaroni et
235 al., 2019; Russell, 2014; Shirk et al., 2012; Terry et al., 2020; Wäldchen and Mäder, 2018).

236
237 There can be an economic incentive to using citizen science. While there are costs, such as
238 technology needs and staff salaries (Blaney et al., 2016), and recruiting, training, and retaining
239 volunteers (Blaney et al., 2016; McKinley et al., 2017; Silvertown et al., 2013), overall costs are
240 lower than hiring an equivalent number of staff (Joint Nature Conservation Committee, 2017).
241 For example, 100,386 users participated in the first 180 days of seven projects on the broad
242 Zooniverse platform, contributing 129,540 hours estimated at \$1.6 million USD (Sauermann and
243 Franzoni, 2015). Theobald et al. (2015) estimated that about 1.3 million citizen scientists
244 contributed \$2.5 billion USD in-kind annually over 388 projects. Investments can therefore bring
245 high returns. Indeed, the Joint Nature Conservation Committee (nd, cited in MacKechnie et al.
246 2011) estimated that a £7 million government investment into volunteer monitoring in 2007-
247 2008 facilitated an in-kind outcome of about £20 million from volunteers. However, citizen
248 science should not entirely replace research by academic or government organizations,
249 particularly as many governments require data to enact parts of their environmental legislation
250 and thus should bear responsibility for the cost and commitment to collect the data (Birkin and
251 Goulson, 2015; Conrad and Hilchey, 2011; Hoyer et al., 2012; Le Féon et al., 2016; MacKechnie
252 et al., 2011; Owen and Parker, 2019; Silvertown, 2009).

253

254 3.2.2 Value to Participants

255 Citizen science can increase awareness, knowledge, and skills, as well as conservation and
256 advocacy efforts among participants and the public (Bubela et al., 2009; Conrad and Hilchey,
257 2011; Le Féon et al., 2016; McKinley et al., 2017; Miller-Rushing et al., 2012; NASEM, 2018;
258 Societize Consortium, 2013; Toomey and Domroese, 2013). As we are in an age of increasing
259 environmental degradation and disconnect from nature, public engagement and nature based
260 experiences are key (Acorn, 2017; Conrad and Hilchey, 2011; Hannibal, 2016; Schuttler et al.,
261 2018; Societize Consortium, 2013).

262

263 A person's attitude towards, and knowledge about, the environment can predict and influence
264 their behaviours related to conservation (Bickford et al., 2012; Jordan et al., 2012; Toomey and
265 Domroese, 2013). Participation in citizen science projects can lead to a closer relationship to
266 nature and a greater appreciation of species and their environment (Acorn, 2017; Bickford et al.,
267 2012; Schuttler et al., 2018; Silvertown et al., 2013; Wells and Lekies, 2012). It can also lead to
268 participants becoming experts in the field in the future (Ballard et al., 2017; Hannibal, 2016;
269 Trautmann et al., 2012). But impacts of participation can be short or long lasting (Jordan et al.,
270 2012; Wells and Lekies, 2012), and not all participants report changes in behaviours or actions
271 (Ellwood et al., 2017; Toomey and Domroese, 2013), just as data collection alone does not
272 trigger understanding of scientific processes (Trautmann et al., 2012). Learning is not always an
273 outcome of participation (Bonney et al., 2009a, 2009b; Fitzpatrick, 2012; Jordan et al., 2016,
274 2012; Phillips et al., 2012), and knowledge does not always lead to an increase in actions
275 (Bickford et al., 2012). Participants may volunteer to enjoy time in nature or with like-minded
276 people, rather than specifically for nature conservation (Bell et al., 2008). However, some
277 participants have expressed major changes in how they act (Bonter et al., 2012; Jordan et al.,
278 2016; Toomey and Domroese, 2013), and any positive change is better than no change
279 (Silvertown et al., 2013).

280

281 3.2.2 Value to Policy and Management

282 Citizen science can influence policy and management actions (Acorn, 2017; Conrad and Hilchey,
283 2011; Dickinson et al., 2012; Firehock and West, 1995; Greenwood, 2012; Hoyer et al., 2012;
284 McKinley et al., 2017; Peters et al., 2017; Shirk et al., 2012; Societize Consortium, 2013).

285 However, the impacts of specific projects are often unknown (Acorn, 2017; Harry M. Collins
286 and Evans, 2002; Conrad and Hilchey, 2011; Toomey and Domroese, 2013). More research is
287 needed into the design of projects so that desired outcomes occur (Ballard et al., 2017; Bonney et
288 al., 2014; Societize Consortium, 2013; Toomey and Domroese, 2013).

289

290 3.3. Where can citizen science occur?

291 Projects can literally occur anywhere in the world, although the United States and Canada have
292 the fastest growing number of programs (Lawrence 2006 in (Conrad and Hilchey, 2011)). Urban
293 environments are well suited (Davies et al., 2011; van der Wal et al., 2015) but activities can
294 happen anywhere: backyards, urban parks, conservation areas, other natural and agricultural
295 areas, or anywhere there is a computer or smart device and internet access (Bonter et al., 2012;
296 EarthWatch, 2018; Griffin Burns and Harasimowicz, 2012; Hannibal, 2016; Khatib et al., 2011;
297 Russell, 2014; Ryan et al., 2018). Projects may be local, provincial/state/territorial, national, or
298 international in scope.

299 3.4 Who are citizen scientists?

300 Just as there is no one definition for citizen science, there is no consensus for what a participant
301 is called. There is debate over the term to use, as the language has implications for both
302 volunteer management and knowledge generation (Eitzel et al., 2017). The original use of the
303 term “citizen scientist” has been credited to Rick Bonney at Cornell University in the United
304 States in the mid-1990s (Hannibal, 2016), although Alan Irwin used the term in Europe in 1994
305 (Follett and Strezov, 2015; Hannibal, 2016; Irwin, 1995).

306

307 The very first naturalists can be considered citizen scientists (Bonter et al., 2012; Dickinson and
308 Bonney, 2012; Miller-Rushing et al., 2012; Russell, 2014; Silvertown, 2009). Phenological
309 records date back over three thousand years in China (Bonter et al., 2012; Russell, 2014). Many
310 early naturalists were not professional scientists and conducted their explorations on the side
311 (Bonter et al., 2012; Dickinson and Bonney, 2012; Russell, 2014; Silvertown, 2009). Over time,
312 more individuals were hired as professional researchers, and those who pursued their work as a
313 hobby began to be considered as amateurs (Miller-Rushing et al., 2012; Silvertown, 2009).
314 However, “amateurs” may be well educated, have skills in the area, and even be leading experts
315 in the field (Bell et al., 2008; Bonter et al., 2012; H. M. Collins and Evans, 2002; Miller-Rushing
316 et al., 2012; Shirk et al., 2012).

317

318 Citizen scientists today are people who generally volunteer on their own time with scientific
319 projects (Dickinson and Bonney, 2012); they range in their level of expertise, although most
320 projects do not require formal training, credentials, or experience (Acorn, 2017; Danielson et al.,
321 2014; Hannibal, 2016). People of all ages, sexes, and abilities can participate. Age generally does
322 not have an effect on volunteer ability or rate of participation (Ballard et al., 2017; MacPhail et
323 al., 2020; Silvertown et al., 2013), but different ages may be better suited for certain activities
324 (Griffin Burns and Harasimowicz, 2012; Silvertown et al., 2013; van der Velde et al., 2017).

325 Participants can volunteer individually, with their family, school, or with a group of similar or
326 mixed ages (Ballard et al., 2017; Bonter et al., 2012; Frigerio et al., 2018; Griffin Burns and
327 Harasimowicz, 2012; Trautmann et al., 2012; van der Velde et al., 2017). However, individuals
328 who are the subject or focus of the research project are not citizen scientists (NASEM, 2018).

329
330 Generally program participants are not as diverse as they could be, with most being middle-aged
331 or older (MacPhail et al., 2020; Purcell et al., 2012; Toomey and Domroese, 2013), female
332 (Toomey and Domroese, 2013), upper-middle class and white (NASEM, 2018; Purcell et al.,
333 2012). Programs also tend to target and involve groups of avid participants/hobbyists and not the
334 general public (Fitzpatrick, 2012). However technology is allowing citizen science projects to
335 cross cultural, language, literacy, and physical barriers (Bonney et al., 2014; Danielson et al.,
336 2014; Hannibal, 2016; Kawrykow et al., 2012; Khatib et al., 2011; Liebenberg et al., 2017;
337 Russell, 2014).

338

339 3.5 Why do citizen scientists participate?

340 Participants participate for many reasons. Some enjoy the competition to find rare species or
341 more species than others, the ability to survey in areas lacking in data, or to add to their life lists
342 of species (Acorn, 2017; Hannibal, 2016; Prudic et al., 2017; Russell, 2014; Sullivan et al., 2009;
343 van der Wal et al., 2015). Others want to learn about the world around them (Bonter et al., 2012;
344 Shirk et al., 2012; Trautmann et al., 2012; van der Wal et al., 2015; Voss et al., 2017), contribute
345 to our overall knowledge (Dickinson and Bonney, 2012; Shirk et al., 2012; Trautmann et al.,
346 2012), help with conservation efforts (Lewandowski and Oberhauser, 2017; MacPhail et al.,
347 2020; Shirk et al., 2012; van der Wal et al., 2015), gain local knowledge related to a concern in
348 the community (Conrad and Hilchey, 2011; Firehock and West, 1995; Greenwood, 2012;
349 Hannibal, 2016; Miller-Rushing et al., 2012; Roy and Edwards, 2019; Russell, 2014; Shirk et al.,
350 2012) or influence decision making (Conrad and Hilchey, 2011; Shirk et al., 2012).

351

352 Many love the social aspect of participating (Bell et al., 2008; NASEM, 2018; Shirk et al., 2012;
353 van der Wal et al., 2015) while others appreciate being alone in nature (Bell et al., 2008). Some
354 participate through school projects (Oberhauser and Lebuhn, 2012; Russell, 2014; Worthington
355 et al., 2012) or to protect their livelihoods ((Danielsen et al. 2007) in (Shirk et al., 2012)).
356 Improving personal skills and abilities is important (Bell et al., 2008; Bonter et al., 2012;
357 Dickinson and Bonney, 2012; Shirk et al., 2012; van der Wal et al., 2015) but so is having fun
358 (Hannibal, 2016; Kawrykow et al., 2012; Khatib et al., 2011; Ponti et al., 2018), and improving
359 their health (Bell et al., 2008; Wells and Lekies, 2012).

360

361 3.6 Experimental design, data collection, quality control, and analyses

362 A variety of experimental designs exist, from one-off collections or incidental observations to
363 formal atlas squares or assigned routes (Acorn, 2017; Bonter et al., 2012; McKinley et al., 2017;
364 Sullivan et al., 2017; Zuckerberg and McGarigal, 2012). Resources for guiding citizen science
365 projects are compiled by the US government (CitizenScience.gov, 2020), Citizen Science
366 Association (2020), California Academy of Sciences (2019), and other organizations (Pocock et
367 al., 2014; Tweddle et al., 2012). There are also specific resources for data management,
368 including ensuring data validation and quality and control assurances are in place (Kelling, 2012;
369 NEIWPC, 2016; Strasser et al., 2012; USEPA, 2002; Wiggins et al., 2013).

370

371 Projects can be designed to answer specific questions or to collect data broadly (Cooper et al.,
372 2012; Hannibal, 2016), but study design must be considered in order for the project's results to
373 be accepted and its impacts measured (Acorn, 2017; Bonney et al., 2009b; Bonney and
374 Dickinson, 2012; Conrad and Hilchey, 2011; Hannibal, 2016; Shirk et al., 2012; Strasser et al.,
375 2012; Wiggins et al., 2013). Project designers must consider the potential participants and their
376 skill levels, and develop training materials and methods to suit (Dickinson and Bonney, 2012;
377 Frigerio et al., 2018).

378

379 Project design is often done by professional researchers but can also include, or even be led by,
380 members of the public, stakeholders, and other professionals (Bonter et al., 2012; Conrad and
381 Hilchey, 2011; Cooper et al., 2012; Dickinson and Bonney, 2012; Shirk et al., 2012). Additional
382 members can include individuals experienced in statistics (Bonney and Dickinson, 2012; Cooper
383 et al., 2012; Hannibal, 2016); data management and analyses (Bonney and Dickinson, 2012;
384 Kelling, 2012); computer programming (Ceccaroni et al., 2019; Frigerio et al., 2018; Jordan et
385 al., 2012; Terry et al., 2020; Wäldchen and Mäder, 2018); volunteer management; collective
386 action; and social networking theory (Jordan et al., 2012; Purcell et al., 2012; Triezenberg et al.,
387 2012; Wells and Lekies, 2012).

388

389 New statistical and computational techniques are being developed that better compile and
390 analyze complex and unstructured data sets (Acorn, 2017; Bonney et al., 2014; Cooper et al.,
391 2012; Dickinson and Bonney, 2012; Fink and Hochachka, 2012; Gonsamo et al., 2013; Pocock et
392 al., 2015). They can handle "sampling bias, detection, measurement error, identification, and
393 spatial clustering (Bird et al. 2013, Munson et al. 2010)" (Bonney et al., 2014), nonindependence
394 (Cooper et al., 2012), false negatives (Steve Kelling et al., 2015), and various other errors or
395 biases (Acorn, 2017; Fink and Hochachka, 2012; Gonsamo et al., 2013; Johnston et al., 2018).
396 They can also be used for data mining (Fink and Hochachka, 2012) and model validation (Fink
397 and Hochachka, 2012).

398

399 Historically, participants mailed paper records to researchers, although most now enter records
400 digitally (Bonter et al., 2012; Purcell et al., 2012). Physical specimens may still be mailed to
401 researchers (Acorn, 2017; Hannibal, 2016; Le Féon et al., 2016), viewed in person (Acorn,
402 2017), or identified from photos (Acorn, 2017; Blake et al., 2012; Falk et al., 2019; MacPhail et
403 al., 2020; Soroye et al., 2018). Some programs tag animals with the tags later viewed or
404 recovered by other individuals, who then pass the information to the researchers (Acorn, 2017).

405

406 Data may be collected in field notebooks (Acorn, 2017), data sheets (Worthington et al., 2012),
407 smart devices (Frigerio et al., 2018; Pimm et al., 2014), or transcribed from historic images or
408 specimens (Acorn, 2017; Cooper et al., 2012; Hannibal, 2016). The information can be e-mailed
409 to the researcher (Acorn, 2017; Hannibal, 2016; Le Féon et al., 2016), entered through an online
410 portal (Blake et al., 2012; MacPhail et al., 2020; Pimm et al., 2014; Silvertown et al., 2015;
411 Toomey and Domroese, 2013; Worthington et al., 2012), shared on and/or culled from social
412 media (Acorn, 2017; Daume and Galaz, 2016; Hannibal, 2016; Russell, 2014; Smith et al.,
413 2017), and photo sharing sites (Hiller and Haelewaters, 2019; Stafford et al., 2010). New
414 technology allows for some data to be automatically recorded and transferred to researchers
415 (Cooper et al., 2012), or identified automatically (Ceccaroni et al., 2019; Terry et al., 2020;

416 Wäldchen and Mäder, 2018). Not all programs require confirmation of observations, although
417 most have techniques to lower errors in the data (Acorn, 2017; Bonter et al., 2012; S Kelling et
418 al., 2015).

419

420 The classical citizen science paradigm has participants collecting the data, including identifying
421 species, and sending it directly to the researchers, while in the expert-assisted paradigm,
422 participants collect materials and send that to the researchers or other experts to identify (Le
423 Féon et al., 2016). Some species groups are well suited for the classical paradigm as they are
424 easy for citizen scientists to identify but others are more difficult (Le Féon et al., 2016).

425 Alternatives include accepting a higher taxonomic level of identification or involving experts,
426 although having enough experts to do the identifications is a challenge (Falk et al., 2019;
427 Kremen et al., 2011; Le Féon et al., 2016; MacPhail et al., 2020). A further challenge is the
428 quality and composition of the photos or specimens submitted (Austen et al., 2018).

429

430 The accuracy of participants as compared to experts needs to be considered, as volunteers may
431 have less formal training and/or inherent biases (Austen et al., 2016; Blaney et al., 2016;
432 Danielson et al., 2014; Johnston et al., 2018; Roy and Edwards, 2019; Silvertown et al., 2015;
433 Trautmann et al., 2012). Yet often their ability to identify species is not questioned, and their
434 experience not quantified or accounted for (Acorn, 2017; Austen et al., 2016). Some programs
435 will accept identifications from anyone, others have developed a ranking system that takes into
436 account the individual's skill, and others allow participants to suggest an identification that is
437 verified by experts (Acorn, 2017; Blake et al., 2012; Falk et al., 2019; MacPhail et al., 2020;
438 Silvertown et al., 2015). However, in many cases, citizen scientists can provide accurate data
439 (Acorn, 2017; Austen et al., 2018; Ballard et al., 2017; Bonter et al., 2012; Danielson et al.,
440 2014; Hoyer et al., 2012; Kremen et al., 2011; Lovell et al., 2009). Although the accuracy of the
441 expert is not often questioned, it can be variable (Austen et al., 2018; Suzuki-Ohno et al., 2017).

442

443 There can be serious repercussions for misidentifications, such as “the accidental culling of
444 endangered species...(Hunt 2015), the incorrect monitoring of harmful algal blooms
445 (Culverhouse et al. 2013), the unobserved decline in important fish stocks (Beerkircher et al.
446 2009), and wasted resources,(Solow et al 2012)” (Austen et al., 2016). It can also “affect
447 assessments of population status and distribution and result in erroneous conservation decisions
448 (Elphick 2008, Shea et al. 2011, Runge et al. 2007)” (Austen et al., 2016). It is therefore
449 important to understand the level of potential error during study design and analysis, and when
450 developing conservation actions (Austen et al., 2016). This is particularly true for programs that
451 do not keep photos or specimens (Acorn, 2017; Worthington et al., 2012).

452

453 Spatial biases are reflected in e.g. more data coming from densely populated areas than rural
454 areas (Blaney et al., 2016; van der Wal et al., 2015), although this may be balanced by skilled
455 naturalists focusing outside of urban areas and lay individuals inside (van der Wal et al., 2015).
456 Species biases occur through selective reporting, over-reporting, or under-reporting of rare or
457 enigmatic species (Acorn, 2017; Gardiner et al., 2012; S Kelling et al., 2015; Stribling et al.,
458 2008; van der Wal et al., 2015). Temporal biases result from observations occurring more at
459 certain times of the day or year than others (van der Wal et al., 2015). Non-standard search
460 efforts can be sensitive to these biases (Acorn, 2017; Pocock et al., 2015).

461

462 Interpretation of data may need to consider the popularity of a program as compared to the
463 number of submissions (e.g. is a species increasing or are more individuals participating)(van der
464 Wal et al., 2015). Researchers also need to consider false positives (reporting a species that is not
465 present) and false negatives (not reporting a species that is present) (S Kelling et al., 2015). Zero
466 data (e.g. absence of a species) is often not collected but is very important (Cooper et al., 2012;
467 Russell, 2014).

468
469 Quality assurance and control, and data validation, are important aspects of all programs. Any
470 project has the potential for errors (deliberate or accidental); researchers must attempt to
471 recognize, control, and fix or remove them (MacKechnie et al., 2011; NEIWPC, 2016;
472 Rasmussen, 2019; Roy and Edwards, 2019; Strasser et al., 2012; USEPA, 2002; Wiggins et al.,
473 2013; Worthington et al., 2012). Some programs may keep erroneous data in user profiles and
474 online maps so as to not hurt the observers feelings; this is concerning and it is important for data
475 users to obtain a good understanding of the data status and background before using (Bonter et
476 al., 2012). Misconduct and incorrect information should be corrected immediately to prevent
477 problems with credibility, data analyses, and funding (Rasmussen, 2019; Roy and Edwards,
478 2019).

479
480 Both current and historic data sets can cover a spectrum of data types, techniques, and levels of
481 participation (Miller-Rushing et al., 2012; Worthington et al., 2012). It is important to review
482 any program documentation to determine the value and quality of the data and how the details
483 may affect analyses (Kelling, 2012; Miller-Rushing et al., 2012; Wiggins et al., 2013).

484

485 3.7 Challenges with citizen science

486 Although there are many positive outcomes of citizen science, there are also challenges and
487 drawbacks (Figure 2). These include issues involving participants, researchers, experimental
488 design and data collection, data use, and the need for specialists. While they may not be unique
489 to citizen science programs, they still should be identified and addressed. Some solutions are
490 discussed in section 3.10.

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Figure 2. Example challenges of citizen science.

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Barriers related to economics, social status, culture, accessibility, time, language, transportation, plus discrimination, lack of trust, or a perception of science being “boring”, may prevent individuals from participating (Acorn, 2017; Birkin and Goulson, 2015; Bonter et al., 2012; Conrad and Hilchey, 2011; Purcell et al., 2012; Worthington et al., 2012). Designing and running a citizen science program can take time away from researcher’s professional work and potentially reduce their productivity (Dickinson and Bonney, 2012; Silvertown et al., 2013); early career researchers may not be able to make the necessary commitment (Irwin, 2018). Obtaining adequate funding to start and sustain projects can also be a challenge (Blaney et al., 2016; Bonter et al., 2012; Conrad and Hilchey, 2011; Dickinson and Bonney, 2012; Frigerio et al., 2018; Silvertown, 2009; Silvertown et al., 2013).

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Projects may not have a robust experimental design, such as an adequate sample size or a plan to analyze the data (Bonney and Dickinson, 2012; Conrad and Hilchey, 2011). They may collect the wrong type of data or be seen as monitoring for the sake of monitoring (Conrad and Hilchey, 2011; Toomey and Domroese, 2013). With the variation in the types and scope of data being collected, new computer programs and types of analyzes are needed (Bonney and Dickinson, 2012; Ceccaroni et al., 2019; Conrad and Hilchey, 2011; Cooper et al., 2012). Any delays in identifications or analyses can have a negative effect on participant involvement, as well as for end users such as policy makers and conservationists (van der Wal et al., 2015).

514
515 Unfortunately, due to concerns related to quality, validity, and consistency of the data and
516 experimental design, results of citizen science programs are not always accepted or used by other
517 researchers, peer-reviewed journals, or decision makers (Burgess et al., 2017; Conrad and
518 Hilchey, 2011; Cooper et al., 2012; Hoyer et al., 2012; Rasmussen, 2019; Silvertown et al.,
519 2013). While Burgess et al. (2017) found that data quality itself was not a strong barrier to
520 researcher use of data, lack of awareness of the data and researcher bias were. These concerns
521 can mean that much-needed data for species conservation status assessments may be excluded,
522 targeted habitat conservation actions may not occur, ongoing environmental issues (e.g.
523 pollution, noise) may not be addressed, models may not be validated correctly, and policy may
524 not be developed. As well, funders of the program may be upset that there were “no” results and
525 be reluctant to fund additional programs in the future, and volunteers may be disheartened by the
526 impression their work was not useful and not participate in the future. Other programs may not
527 be able to learn from or build off the excluded program(s) data. Finally, the discrediting of some
528 citizen science data may put a pall over other programs, negatively influencing their success and
529 impressions.

530
531 It is difficult to make broad statements about the impact of citizen science as there is no
532 standardized method of assessment (Bonney et al., 2009a; Conrad and Hilchey, 2011; Jordan et
533 al., 2012; Phillips et al., 2012), although frameworks are being discussed (Bonney et al., 2009a;
534 Ellwood et al., 2017; Jordan et al., 2012; Phillips et al., 2012; Toomey and Domroese, 2013;
535 Wells and Lekies, 2012). Most frameworks are based on those that evaluate public participation
536 in scientific research (Blaney et al., 2016; Phillips et al., 2012; Schröter et al., 2017), while some
537 are specific to children and their environmental attitudes, behaviours, knowledge, and measure of
538 fear (Wells and Lekies, 2012), or specific to informal science education (Bonney et al., 2009a;
539 Phillips et al., 2012). Current methods have trouble evaluating slight changes in knowledge or
540 attitude, particularly when a participant already had experience in an area (Phillips et al., 2012),
541 or to prove that learning was a result of participation (Phillips et al., 2012). It is still important to
542 take pre and post measures in order to evaluate impacts of participation, whether through
543 workshops, online quizzes, or other methods (Phillips et al., 2012; Wells and Lekies, 2012).
544 Participants have different cultural, economic, social, ethnic, and geographic makeup, making
545 analyses even more difficult (Phillips et al., 2012).

546
547 While much of science relies on comparison to a control group, it is hard to get unbiased groups
548 for citizen science projects, particularly for randomized control trials (Phillips et al., 2012; Wells
549 and Lekies, 2012). This could potentially be accomplished by having a waiting list of people
550 who may/will participate in the future, with individuals randomly assigned to the wait list and the
551 participation groups (Wells and Lekies, 2012).

552
553 There are also areas of research that can not be done by citizen scientists, where professionals are
554 required due to specialized experience, equipment, or other project requirements (Blaney et al.,
555 2016; Fitzpatrick, 2012; Tidball and Krasny, 2012). Professionals may be required to meet
556 regulations, such as with animal handling or health and safety (Buesching & Slade 2012 in
557 (Silvertown et al., 2013)), or site access concerns (Blaney et al., 2016). Finally, some argue that
558 long-term monitoring should only be done by professionals rather than volunteers (Luzar et al.
559 2011 in (Danielson et al., 2014)).

560

561 3.8 Economic, social, and political-economic controversy

562 Citizen science can provide cost-effective ways for data collection (see discussion above).
 563 However, a social and political-economic controversy exists related to the reduction in funding
 564 many projects are experiencing or the unequal funding paid to new or high-profile projects
 565 (Ancker and Flanagan, 2007; Bonter et al., 2012; Bozeman and Gaughan, 2007; Bubela et al.,
 566 2009; Conrad and Hilchey, 2011; Godfray et al., 2015; Hannibal, 2016; Nestle, 2001;
 567 Rosenstock and Lee, 2002; Silvertown et al., 2013).

568

569 One area of concern is that funding can be cut, only given in the short-term, and/or be vulnerable
 570 to loss. Monitoring projects in particular are often not seen to provide a lot of value (Hannibal,
 571 2016; Silvertown et al., 2013). Projects face problems if funding is reduced (Conrad and Hilchey,
 572 2011), as is common with funders that prefer to support new programs, even if longer-running
 573 programs produce more valuable data and other outcomes (Blaney et al., 2016; Dickinson and
 574 Bonney, 2012). Even if funding is maintained, projects can struggle to meet deliverables and
 575 expand (Bonter et al., 2012). However, cutbacks in internal government funding can cause an
 576 increase in citizen science, as governments still want, and may even be required by law, to
 577 collect data and carry out monitoring (Conrad and Hilchey, 2011; Owen and Parker, 2019); in
 578 these cases, they should make funding citizen science a priority (Conrad and Hilchey, 2011).

579

580 Funding may come with requirements, such as working with industry partners (Bozeman and
 581 Gaughan, 2007). A dependency on private funding and bureaucracy can also limit or decrease
 582 public trust (Bubela et al., 2009). In the United States, federal funding is decreasing annually
 583 while industry funding is increasing, which brings potential concerns about directions of research
 584 and biases (Bozeman and Gaughan, 2007; Rosenstock and Lee, 2002). Funding may come from
 585 participants themselves via participation fees or material costs (Bell et al., 2008; Bonter et al.,
 586 2012; Chu et al., 2012; EarthWatch, 2018; Silvertown et al., 2013).

587

588 Politics and legislation can encourage or discourage citizen science. For example, Wyoming
 589 passed a law in 2015 that permitted charging individuals who collect “resource data” on “open
 590 lands” as trespassers if they intend to submit that information to the government; the law was
 591 amended in 2016 but it is still a discouragement to citizen scientists (Opar, 2017; Pidot, 2015).
 592 Wyoming has also pushed to only allow water quality data to be collected by governmental
 593 entities or contractors, which would prohibit citizen science (Thuermer, 2020; Wyoming
 594 Department of Environmental Quality, 2020). However, the United States government passed
 595 legislation in 2017 that explicitly permitted the involvement of crowd sourcing and citizen
 596 science activities that furthered the missions of its federal science agencies (United States
 597 Government, 2017). The US also assembled an online toolkit to facilitate citizen science
 598 (CitizenScience.gov, 2020).

599

600 3.9 What is success and how can it be measured?

601 Individuals, science, and society all benefit from citizen science (Bonney et al., 2014; Irwin,
 602 2018; McKinley et al., 2017; NASEM, 2018; Sharma et al., 2019; Sterling et al., 2017; Sullivan
 603 et al., 2017). Outcomes vary depending on why the project was created, how it was designed and

604 data used, and how the volunteers embraced it (Ballard et al., 2017; Bonney et al., 2016; Ellwood
605 et al., 2017; Forrester et al., 2017; NASEM - National Academies of Sciences Engineering and
606 Medicine, 2018; Ponti et al., 2018; Theobald et al., 2015). Quantifiable outcomes include
607 number of individuals involved, data records, website visits, publications, workshops and media
608 articles, (Aceves-Bueno et al., 2017; Bonter et al., 2012; Follett and Strezov, 2015; Gonsamo et
609 al., 2013; Irwin, 2018; Phillips et al., 2012; Shirk et al., 2012; Theobald et al., 2015). Qualitative
610 outcomes include an increase in knowledge or the quality of volunteer involvement (Bonney and
611 Dickinson, 2012; Shirk et al., 2012).

612 Projects may have vastly different numbers for their metrics of success, often due to the type and
613 longevity of the program, but all be considered equally successful by their organizers. For
614 example, the stand alone, single city Neighbourhood Nestwatch program had at least 12 peer-
615 reviewed publications after about a decade (Bonter et al., 2012), while at least 150 have come
616 from the Cornell Lab of Ornithology, which has been involved in multiple projects globally for
617 about a century (Cornell Lab of Ornithology, 2018). Projects associated with the international
618 Earthwatch organization averaged 6.5 publications and 5.2 contributions to management plans
619 and policies each over a seven year period (Chandler et al., 2017). Other projects may not
620 publish their results in peer-reviewed journals (Follett and Strezov, 2015; Sullivan et al., 2017;
621 Theobald et al., 2015) but in other areas like project newsletters (Follett and Strezov, 2015).

622 The number of observations submitted to a program also varies. The online Zooniverse platform
623 reports over 12 million daily observations across its programs (Sauermann and Franzoni, 2015),
624 while the international eBird program had more than 300 million observations submitted in the
625 first twelve years of the program, with more than 70 million in 2015 alone (Sullivan et al., 2017).
626 The North American eButterfly receives tens of thousands of observations per year (Prudic et al.,
627 2017), while the UK BeeWatch had 10,000 records submitted and verified in its first three and a
628 half years of operation (van der Wal et al., 2015). The Global Biodiversity Information Facility
629 has estimated that “half of its billions of data points [come] from lay sources [and] that it has
630 supplied data for more than 2,500 peer-reviewed papers in the past ten years” (Irwin, 2018).

631 Generally only a small fraction of people who express interest in a project participate, and even
632 fewer are high contributors (Andow et al., 2016; Birkin and Goulson, 2015; Domroese and
633 Johnson, 2017; MacPhail et al., 2020; Sauermann and Franzoni, 2015; Wood et al., 2011;
634 Worthington et al., 2012); this seems to be particularly true for projects that are larger in size
635 and/or online, although some projects do have high retention rates (Bonter et al., 2012;
636 McCaffrey, 2005; Sauermann and Franzoni, 2015; Theobald et al., 2015). However, “super
637 volunteers” help to offset overall lower participation rates (Hames et al., 2012; Hannibal, 2016;
638 MacPhail et al., 2020; Sauermann and Franzoni, 2015; Wood et al., 2011). Previous experience
639 by participants may increase the success of data collection (Birkin and Goulson, 2015; Danielson
640 et al., 2014; S Kelling et al., 2015); over time, the learning curve decreases while accuracy and
641 breadth of data increases (Danielson et al., 2014; S Kelling et al., 2015).

642 Participation can result in an increased understanding of and interest in science (Bonney and
643 Dickinson, 2012; McKinley et al., 2017). It can result in participants becoming resources to be
644 approached by others (conservation professionals, school groups, etc.) (Bonter et al., 2012), or

645 participants asking their own questions, which in turn could be answered by using citizen science
 646 data (Dickinson and Bonney, 2012).
 647

648 3.10 How can citizen science programs be improved?

649

650 3.10.1 Study design

651 As every project has different goals and outcomes, there is no one experimental design that will
 652 work for all projects. However, researchers can still use standardized techniques and obtain
 653 useable data (Cooper et al., 2012; Shirk et al., 2012). Programs based at regional citizen science
 654 societies and related organizations (e.g. citizenscience.gov, citizenscience.org,
 655 citizensciencealliance.org, ecsa.citizenscience.net, citizenscience.org.au, and citsci.org), in
 656 addition to the peer-reviewed journal on citizen science
 657 (theoryandpractice.citizenscienceassociation.org), provide resources to assist others, although
 658 additional funding and collaboration with experts would improve them further (Bonney et al.,
 659 2014; Ellwood et al., 2017; Russell, 2014).
 660

661 Repeated sampling at a site is preferred versus one-off observations to better account for site or
 662 user effects, distinguish between false positives and negatives, and to evaluate changes over time
 663 (Acorn, 2017; Cooper et al., 2012; Hannibal, 2016; Zuckerberg and McGarigal, 2012), although
 664 long-term repetition of point in time collections can still help to find new species, range
 665 extensions, and other data (Acorn, 2017). A few ways to avoid non-random/unrepresentative
 666 data include using a stratified random sampling design or gridding the region of interest; non-
 667 random distribution of sampling points can be taken into account for analysis and interpretation
 668 (Cooper et al., 2012; Greenwood, 2012). It is important that all areas that need to be surveyed are
 669 included in the study (e.g. to compare historically surveyed sites), rather than having an open
 670 survey process (van der Wal et al., 2015; Worthington et al., 2012). However, observations that
 671 are not from repeated survey sites, including those that are incidental, can still be used and can
 672 be quite valuable (Gazdic and Groom, 2019; Hochachka et al., 2012; MacPhail et al., 2019;
 673 Meiners et al., 2020; Mueller et al., 2019; Sullivan et al., 2017; Wilson et al., 2020; Zapponi et
 674 al., 2017).
 675

676 Projects must encourage the submission of zero data (Cooper et al., 2012; Russell, 2014) and the
 677 recording of search effort, as this can help researchers identify undersampled or oversampled
 678 areas or quantify variability in data (Zuckerberg and McGarigal, 2012). Where possible, the
 679 project should be set up so that data analyses can include observer skill as a factor (S Kelling et
 680 al., 2015). Researchers should choose the best species to monitor that will both fit with the
 681 research question and be as easy as possible for participants to identify and engage with
 682 (Danielson et al., 2014; Worthington et al., 2012).
 683

684 Pilot studies can help ensure training materials are understood, data is collected efficiently and
 685 accurately, participants are engaged in the program, feedback can be addressed, and data can be
 686 analyzed (Birkin and Goulson, 2015; Bonney and Dickinson, 2012; Bonter et al., 2012; Frigerio
 687 et al., 2018; Greenwood, 2012; Jordan et al., 2012; Shirk et al., 2012; Worthington et al., 2012).
 688 It is important to allow for uncertainty to be acknowledged during data recording or verification

689 (Purcell et al., 2012). Researchers need to determine how to verify records during project design,
690 such as through the submission of photos and not just text (Worthington et al., 2012).

691
692 Standardized terminology, classification codes, and methods of recording and entering data can
693 reduce many errors (Greenwood, 2012; Kelling, 2012; Wiggins et al., 2013). Multiple
694 individuals can also assess the same record to ensure agreement (Russell, 2014). Data can be
695 flagged automatically if they fail pre-set criteria (e.g. spatial, temporal, numerical) or a quality
696 assurance test (Bonter et al., 2012; Kelling, 2012; Russell, 2014; Silvertown et al., 2013),
697 although this latter approach does not catch records that are plausible but incorrect (Bonter et al.,
698 2012). It is best if information can be georeferenced to a precise area, whether it be through GPS
699 units, geocoding based on street addresses, selection of a site through online mapping programs,
700 or other methods, as this may allow for multiple uses of the data, including for habitat and
701 landscape level analyses (Zuckerberg and McGarigal, 2012).

702
703 Project leaders need to identify learning goals before starting, and design protocols that will
704 result in them, realizing that different approaches may be needed for volunteers than traditional
705 ones used with experts (Jordan et al., 2012; NASEM, 2018; Strasser et al., 2012; Wiggins et al.,
706 2013). For retention to be high, projects should meet the needs of the participants and
707 communities involved; researchers need to have someone who can relate to the community and
708 understand their concerns/biases/strengths (Purcell et al., 2012; Trautmann et al., 2012).

709
710 It is important to assess the value and viability of projects at all stages. Blaney et al. (2016)
711 discuss four methods, including Return On Investment (values based on financial aspects alone),
712 Cost-Benefit Analysis (values to society, including monetary and non-monetary ones), Cost-
713 Effectiveness Analysis (monetary costs of citizen science as compared to different options), and
714 Multi-Criteria Analysis (comparing value of different options using monetary and non-monetary
715 costs). As more organizations undertake these evaluations, more evidence can be gathered to
716 support current and future investment in citizen science projects.

717 718 **3.10.2 Volunteer recruitment, training, support, retention**

719 Individuals react differently to recruitment materials depending on their age, national or cultural
720 identity, societal class, and educational background (Silvertown et al., 2013). They also have
721 different motivations for volunteering, from wanting to learn new skills to making a difference in
722 their community to feeling a sense of power (Bonney and Dickinson, 2012; Chu et al., 2012;
723 Domroese and Johnson, 2017; MacPhail et al., 2020; Silvertown et al., 2013). Therefore
724 programs must develop specific messages and use different communication channels, depending
725 on the group(s) they wish to target, rather than one message for a general audience (Bonney and
726 Dickinson, 2012; Chu et al., 2012; Silvertown et al., 2013; Worthington et al., 2012). Wymer
727 (2003) in (Chu et al., 2012) suggests that volunteers be considered as customers, and similar
728 principles considered and actions taken as done by businesses in finding and retaining new
729 customers.

730
731 Communications should be made locally relevant, even if part of a broader project (Chu et al.,
732 2012). Messaging should reinforce reasons for and positive outcomes of participation, such as by
733 announcing a data gap in a specific region and the need for people to submit information (van
734 der Wal et al., 2015), or by promoting the health and wellness benefits of participating (Chu et

735 al., 2012), while also linking the scientific and conservation angles (Chu et al., 2012).
736 Communications can also tie into specific events (Worthington et al., 2012), and contests and
737 promotions can increase media attention and recruit new people to a project (Chu et al., 2012).
738

739 Barriers to participation must be considered and avoided where possible. For example, a required
740 payment for participation may be prohibitive (Bell et al., 2008; Bonter et al., 2012; Silvertown et
741 al., 2013). Projects that have support and training materials in multiple languages, or heavily rely
742 on graphics versus written text, can reach more people (Liebenberg et al., 2017; Purcell et al.,
743 2012; Worthington et al., 2012). However projects may unconsciously exclude certain minority
744 or underrepresented groups (NASEM, 2018; Purcell et al., 2012). Project organizers must ensure
745 projects are inclusive, equitable, and diverse (NASEM, 2018). Partnerships with other
746 organizations can help researchers reach niche communities or underserved audiences (Chu et
747 al., 2012; Purcell et al., 2012; Silvertown et al., 2013).
748

749 Youth involvement is also encouraged as involvement as a youth translates into involvement as
750 an adult, and there is a concern that the current majority of volunteers may soon no longer
751 participate due to age (Wells and Lekies, 2012). As well, there is a need to get more families and
752 children out into the natural world “to know it and care for it” (Dickinson and Bonney, 2012),
753 and “build their capacity for future conservation actions” (Ballard et al., 2017).
754

755 Researchers should encourage people to recruit others with whom they rarely interact with in
756 order to bring more people in and move away from “preaching to the choir” approach
757 (Triezenberg et al., 2012). These weak-tie relationships may help spread new information faster
758 than close-tie/strong-tie relationships, although the latter can help to reinforce and foster
759 adoptions of new behaviours (Triezenberg et al., 2012).
760

761 Creating tools of value to participants, like the ability to view their own data online and to
762 explore data submitted by other participants, as well as customized data portals for specific
763 projects or areas, can help lead to increased participant involvement (Acorn, 2017; Chu et al.,
764 2012; Prudic et al., 2017). However, more research is needed to understand why some people
765 contribute to projects while others “free ride” on contributed data (Triezenberg et al., 2012).
766

767 Advertising can be done through a variety of channels, including social media (Birkin and
768 Goulson, 2015; Chu et al., 2012; Liberatore et al., 2018), blogs, YouTube, RSS feed (Chu et al.,
769 2012), websites (Bell et al., 2008; Birkin and Goulson, 2015; Bonter et al., 2012; Toomey and
770 Domroese, 2013), e-mail listservs (Bonter et al., 2012; Toomey and Domroese, 2013),
771 newsletters (Birkin and Goulson, 2015; Bonter et al., 2012), presentations, flyers (Bonter et al.,
772 2012; Chu et al., 2012), special events (Toomey and Domroese, 2013), conferences
773 (Worthington et al., 2012), other organizations (Bonter et al., 2012; Jordan et al., 2012; Wells
774 and Lekies, 2012), and traditional print and broadcast media (Bell et al., 2008; Bonter et al.,
775 2012; Chu et al., 2012; Silvertown et al., 2013; Toomey and Domroese, 2013; van der Wal et al.,
776 2015; Worthington et al., 2012). However, while media can increase awareness of a project, it
777 may not always result in large numbers of volunteers (Silvertown et al., 2013) or it can recruit
778 too many people, overwhelming the program organizers (Bell et al., 2008). It may be necessary
779 to target publicity to groups that are more likely to participate in order to increase recruitment
780 (Worthington et al., 2012).

781
782 Volunteers can be trained in program protocols through a variety of methods. Static training and
783 support documents can be mailed out physically or electronically (Birkin and Goulson, 2015;
784 Bonter et al., 2012; Firehock and West, 1995; Shirk et al., 2012) or resources can be made
785 available online (Birkin and Goulson, 2015; Bonter et al., 2012; Purcell et al., 2012; Shirk et al.,
786 2012; Toomey and Domroese, 2013; Worthington et al., 2012). Participants can carry out
787 simulations of data collection tasks and get feedback, helping them to improve their skills
788 (Bonney and Dickinson, 2012; Jordan et al., 2012; Worthington et al., 2012) while giving
789 researchers the opportunity to evaluate their skill level and potential biases (Dickinson et al.
790 2010 in (Dickinson and Bonney, 2012)).

791
792 Workshops or trainings are often held in-person, varying from a few hours to several days in
793 length (Bonney and Dickinson, 2012; Bonter et al., 2012; Danielson et al., 2014; Hames et al.,
794 2012; Hannibal, 2016; Jordan et al., 2012; Kremen et al., 2011; Le Féon et al., 2016; Silvertown
795 et al., 2013; Toomey and Domroese, 2013). Volunteer accuracy has been shown to increase if
796 training is provided in-person with an expert as compared to just online or mailed materials
797 (Silvertown et al. 2013). Multiple trainings held over time can allow for people to process
798 instructions, build on knowledge, gain experience with the protocols, and avoid information
799 overload (Jordan et al., 2012; Silvertown et al., 2013; Trautmann et al., 2012). Training should
800 be provided on recognizing and avoiding biases, and the consequences of not doing so (Jordan et
801 al., 2012; Silvertown et al., 2013).

802
803 It is important that participants can connect with project leaders. Some programs provide a phone
804 number for participants to call with questions or problems (Birkin and Goulson, 2015; Bonter et
805 al., 2012; Firehock and West, 1995; Purcell et al., 2012; Shirk et al., 2012), while others
806 regularly correspond by e-mail (Bonter et al., 2012; Chu et al., 2012; Purcell et al., 2012;
807 Toomey and Domroese, 2013), and others have participants and researchers meet up periodically
808 during the year (Bonter et al., 2012; Danielson et al., 2014; Hames et al., 2012; Hannibal, 2016).
809 Support and information sharing can come from both researchers and participants through online
810 discussion forums, blogs, and social networking tools (Bonney and Dickinson, 2012; Bonter et
811 al., 2012; Daume and Galaz, 2016; Liberatore et al., 2018; Toomey and Domroese, 2013;
812 Triezenberg et al., 2012). Small programs with more interactions with researchers, particularly
813 in-person, may yield more impact on participants and greater change in their behaviour,
814 knowledge, and actions than programs with solely online training or single workshops (Bonter et
815 al., 2012). More research is needed to understand how virtual communications and trainings
816 work to connect people and create a sense of community (Liberatore et al., 2018; Triezenberg et
817 al., 2012).

818
819 An important aspect of project management involves participant retention, as this decreases
820 initial training and recruitment costs, builds expertise, and increases data quality (Bonter et al.,
821 2012). In addition to regular communications, volunteers want to receive feedback on and be
822 recognized for their efforts, have their motivations for participating met, and have a rewarding
823 experience (Acorn, 2017; Chu et al., 2012; Conrad and Hilchey, 2011; Fitzpatrick, 2012;
824 Greenwood, 2012; NASEM, 2018; Prudic et al., 2017; Purcell et al., 2012; Silvertown et al.,
825 2013). Too often programs are just about getting the data, leaving the participants feeling
826 undesired and unappreciated (Silvertown, 2009).

827
828 Feedback can be automatically sent to volunteers after data is submitted or verified (Russell,
829 2014; Silvertown, 2009; van der Wal et al., 2016, 2015; Worthington et al., 2012), while
830 interactive websites can display their data live and compare it to other data on maps or to past
831 records by the participant (Bonney and Dickinson, 2012; Bonter et al., 2012; Chu et al., 2012;
832 Dickinson and Bonney, 2012; Sullivan et al., 2009). Participant spotlights can be placed online
833 or in newsletters (Chu et al., 2012). A general acknowledgement of volunteers can occur in the
834 media directly, and by sharing results showing the value of their work (Bell et al., 2008;
835 Silvertown et al., 2013; van der Wal et al., 2015).

836
837 Social interactions and a feeling of community with other volunteers and project leaders, whether
838 done in person or electronically, are important to keep people interested and engaged (Bell et al.,
839 2008; Bonter et al., 2012; Hames et al., 2012; Hannibal, 2016; NASEM, 2018; Shirk et al., 2012;
840 Silvertown et al., 2013; Triezenberg et al., 2012). Some programs are small and locally based or
841 have regional branches that can provide a more local connection and targeted information to
842 participants (Bell et al., 2008; Greenwood, 2012). Informal mentorship between more
843 experienced and inexperienced participants can be quite valuable, even with larger programs
844 (Bell et al., 2008). Concerted efforts to communicate with past and present participants and
845 targeted groups can help to regain and increase participation over time even after the initial wave
846 of enthusiasm for a project has passed (Chu et al., 2012).

847
848 It is important for citizen science programs to capture the interest of “super volunteers” and
849 engage and support them (Hannibal, 2016; Silvertown et al., 2013). They could be encouraged to
850 write articles about their participation to be published in newsletters or online (Trautmann et al.,
851 2012), recruited for more in-depth research projects (Cooper et al., 2012; Hames et al., 2012),
852 and encouraged to present at program events or scientific conferences (Trautmann et al., 2012).

853
854 Monitoring can be boring and repetitive, leading to carelessness and lower quality data
855 (Hannibal, 2016; Russell, 2014; Silvertown et al., 2013). The best participants are those who are
856 dedicated to a particular site and are attuned to small changes (Hannibal, 2016; Purcell et al.,
857 2012; Russell, 2014). Successful programs may tie into the participants main interests and skills
858 (Conrad and Hilchey, 2011), livelihoods, regular routines, or to their cultural or spiritual values
859 (Danielson et al., 2014) or their motivations (Chu et al., 2012; NASEM, 2018).

860
861 Projects vary in the type of equipment required. Some projects are only online, requiring users to
862 have a computer and internet access to participate (Hannibal, 2016; Khatib et al., 2011; Russell,
863 2014; van der Wal et al., 2015). Others have the user collect data in the field and then enter it
864 online (Birkin and Goulson, 2015; Bonter et al., 2012; Gonsamo et al., 2013; Jordan et al., 2012;
865 Starr et al., 2014), although sometimes the data are mailed back to the researchers (Acorn, 2017).
866 Participants may be provided with specific items, (Birkin and Goulson, 2015; Jordan et al., 2012;
867 Le Féon et al., 2016) although participants may still need to supply some items (Birkin and
868 Goulson, 2015). The creation and use of localized species lists and field guides can make
869 identifications easier for novices as compared to the more traditional regional or continental
870 guides (Silvertown, 2009).

871

872 3.10.3 Data management, security, longevity

873 Thought must be given to the life cycle of data, particularly for the long term use, reuse, and
874 preservation of the data (Kelling, 2012; Strasser et al., 2012; USEPA, 2002; Wiggins et al.,
875 2013). Funders are increasingly requiring data management plans (Kelling, 2012) and as citizen
876 science data are essentially public data, they should be housed in a permanent collection
877 (Kelling, 2012). It is important to be able to combine project data with other data sets, and plan
878 for their use in the future (Greenwood, 2012; Hannibal, 2016; Wiggins et al., 2013), showing the
879 need for common frameworks and data standards (McKinley et al., 2017).

880

881 Data should be stored in a database management system as this allows access to multiple
882 individuals at once and can link and analyze large quantities of related information in a
883 systematic way (Cooper et al., 2012; Kelling, 2012). This system is different from a spreadsheet
884 program, which is prone to increasing errors or loss of data due to researcher error (Kelling,
885 2012). Database programs can be tied to GIS applications (Cooper et al., 2012), and can be
886 handle data from single or multiple projects (Kelling, 2012). Citizen science programs could
887 often support a common database structure (Bonney and Dickinson, 2012; Kelling, 2012;
888 Worthington et al., 2012), although some program databases will still need to be custom built
889 (Worthington et al., 2012), and success relates to the quality of the database cyber-architecture
890 itself (Newman et al. 2011 in (Acorn, 2017), (Bonney and Dickinson, 2012)).

891

892 Metadata, or information about the methods used to gather the data, must be developed and
893 associated with the data (Kelling, 2012; Strasser et al., 2012; Wiggins et al., 2013). It is usually
894 in a standardized format, with two interchangeable standards recommended for citizen science:
895 the Biological Data Profile, developed by the Federal Geographic Data Committee (FGDC), and
896 the Ecological Markup Language, developed by the ecological community based on the FGDC
897 standard (Kelling, 2012).

898

899 Data must be protected through multiple secure backups (Acorn, 2017; Bonney and Dickinson,
900 2012; Wiggins et al., 2013). It should also be archived, which is the process of storing data
901 together with the metadata in a long-term storage device (Kelling, 2012; Wiggins et al., 2013). It
902 is important to maintain access to the database, even if or after the project has ended (Acorn,
903 2017). The Cornell Lab of Ornithology has a comprehensive backup and archival process for
904 their data (Kelling, 2012):

905

906 *“First, every month each database is backed up in its entirety, initially to locally running*
907 *disks and then off-site to a tape/disk backup system. Any and all changes made to the*
908 *database are also simultaneously written locally to “change logs” on two different disk*
909 *volumes. The logs are copied to the off-site system every four hours, and because they*
910 *grow quickly (currently more than 13 GB/day), once or twice each week they are*
911 *packaged into “incremental backups” and copied off-site. Therefore even if the database*
912 *machine suffered a complete loss, only the most recent four hours of user data activity*
913 *would be irretrievable. Finally, we perform database restoration exercises several times*
914 *each year to simulate total loss of the database machine. These exercises prove the*
915 *viability of the backups, improve our restore procedures, and prepare us for an actual*
916 *restore.” (Kelling, 2012)*

917 Prior to a program starting, policies should be developed about data sharing and management, on
918 topics like intellectual property and open access of data, and to outline any legal or liability
919 considerations (Heigl et al., 2019; McKinley et al., 2017; Strasser et al., 2012; Sullivan et al.,
920 2017; Wiggins et al., 2013). Finally, data privacy and confidentiality must be maintained,
921 especially when data are being shared or presented (Heigl et al., 2019; McKinley et al., 2017;
922 Wiggins et al., 2013). This can range from anonymizing data to using locked or password
923 protected storage devices (Wiggins et al., 2013).

924

925 3.10.4 Data awareness, sharing and project overlap

926 Visibility of citizen science programs, and the existence of their data, needs to be increased
927 amongst scientists to increase the data usage; data should be made widely available, and be
928 frequently shared with national or international repositories (Acorn, 2017; Burgess et al., 2017;
929 Heigl et al., 2019; Hochachka et al., 2012; MacPhail et al., 2020; McKinley et al., 2017; Strasser
930 et al., 2012; Sullivan et al., 2017; van der Wal et al., 2015; Wiggins et al., 2013). Projects should
931 be evaluated and the outcomes (both positive and negative) shared to allow others to use it as a
932 model or to improve similar projects; to add to our knowledge of ecosystem function; and to
933 contribute to socio-ecological topics (Blaney et al., 2016; Bonney and Dickinson, 2012; Conrad
934 and Hilchey, 2011; Gonsamo et al., 2013).

935

936 It is important to keep participants informed as to the study's progress and results (Bonney and
937 Dickinson, 2012; MacKechnie et al., 2011). However, participants should be informed from the
938 outset that some questions may take multiple years of data to understand/analyze (Bonney and
939 Dickinson, 2012; Frigerio et al., 2018). Updates and results should be shared with other target
940 audiences, such as landowners, conservation partners, and managers (Bonney et al., 2014;
941 Bonney and Dickinson, 2012; Frigerio et al., 2018). While results should be published in
942 academic, peer-reviewed papers, they must also be provided in formats that participants and
943 other stakeholders can access and understand (Bonney and Dickinson, 2012). Online availability
944 makes it easy for others to access and analyze the data and further increase its reach and value
945 (Bonter et al., 2012; Follett and Strezov, 2015; Hannibal, 2016; Silvertown, 2009; Trautmann et
946 al., 2012; van der Wal et al., 2015). It can also help move citizen science projects along the
947 spectrum from having participants just collecting data to them analyzing the patterns (Hannibal,
948 2016).

949

950 There are pros and cons to the collecting of data or projects under a larger group's umbrella. For
951 example, some smaller grass-roots projects may be best left on their own while others may be
952 taken over by a larger program, particularly if they have more support/resources (Acorn 2017). If
953 data from one project are fed into another, participants need to decide what program to submit
954 their data to, and may decide to bypass the smaller program in favor of going directly to the
955 larger one (Acorn 2017). But by one group supporting smaller groups, they may be able to
956 recruit and support the participants and researchers (Acorn 2017).

957

958 It is also important to avoid duplication of efforts. There can be multiple programs in the same
959 area collecting similar data, which can confuse potential participants and/or result in patchy data
960 (Bonney et al., 2014; Bonter et al., 2012; Russell, 2014). Data collection should be standardized
961 across programs, even if there are additional specific questions, and incorporated into one
962 database (Bonney et al., 2014; Bonter et al., 2012; Russell, 2014).

963

964 3.10.5 Increased funding and paid staff

965 Even with the use of volunteers, programs often struggle with getting enough funds to manage
966 their project. But it is important to consider human resources costs for projects; a paid project
967 leader and/or assistants can greatly increase program success (Bonter et al., 2012; Chu et al.,
968 2012; Greenwood, 2012; Worthington et al., 2012). Assistants can help with project planning,
969 recruitment, promotion, mediation, analyses, and evaluation; respond to participant questions and
970 comments; allow for more projects to be launched; and generally take pressure off the main
971 project leaders (Bonter et al., 2012; Chu et al., 2012; Greenwood, 2012; Worthington et al.,
972 2012). Additionally, the cost to hire or provide honoraria to experts (e.g. for identification
973 services) must be considered in budgets (Le Féon et al., 2016). As discussed earlier, it is
974 important to evaluate the monetary and non-monetary values of projects at all stages (Blaney et
975 al., 2016), which by necessity will take into account expenses in addition to outcomes.
976

977 4. Conclusion

978 While scientific research has been carried out by unpaid individuals for centuries, citizen science
979 as a field is relatively new, increasing in popularity over the last few decades. It allows
980 individuals of various backgrounds and skill levels to develop and/or participate in programs
981 collecting information about the world around them, increasing their knowledge, and potentially
982 changing their behaviours related to conservation. Vast quantities of data are now available to
983 help address research questions that would not otherwise be possible without these participants,
984 which in turn help to inform policy and management decisions. The development of new
985 technologies, particularly computers, smart phones, and high-speed internet, are increasing the
986 depth and breadth of data being collected, and the diversity of volunteers who can participate.
987 New experimental designs, databases, and statistical analyses, and common definitions,
988 frameworks and data standards, are being developed to help collect and process new data alone
989 and in conjunction with historic data, as well as store it securely and allow for sharing amongst
990 participants, stakeholders, and other interested parties.
991

992 However, challenges do exist. It can be difficult to recruit and retain a diverse group of
993 participants. Projects must be carefully and frequently evaluated and adapted as necessary.
994 Researchers may need to gain experience in new disciplines of work, while juggling volunteer
995 management and communication and their basic research, although having dedicated individuals
996 to assist can help. As with any project, but especially with those using large numbers of
997 volunteers, data collection can be patchy, incomplete, or include errors. Similarly, funding can be
998 difficult to obtain, particularly for longer-term studies, and has a high potential for social-
999 economic or political controversy. In some cases, citizen science data is not recognized or used
1000 by other researchers or decision makers, and it can be hard to truly evaluate the outcomes and
1001 impacts of a project. Additionally, small-scale programs, or larger-scale programs with patchy
1002 participation, may not generate the information needed to answer pressing questions, particularly
1003 related to conservation in changing times.
1004

1005 There are still areas where more research is needed, technological through social, and
1006 interdisciplinary teams must be put together when developing and running citizen science
1007 programs. Insights need to be shared and results (both positive and negative) communicated

1008 widely through the citizen science community, the broader scientific ones, and the public. But
 1009 the potential is there for even further involvement and growth of citizen science programs, to the
 1010 value of human societies and healthy ecosystems around the world.

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1017

1018 Declaration of Interest

1019 The authors declare that they have no known competing financial interests or personal
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1021

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