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Expanding general surveillance of invasive species by integrating citizens as both observers and identifiers

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Abstract

Expanding general surveillance activities can improve the detection of invasive species when eradication remains feasible. Traditionally citizens report observations to government agencies and mobile-phone-based tools provide incremental submission and processing efficiencies. However, citizen-reported data has a high proportion of false positives and diagnostics labs are not resourced to process large observation volumes.

We demonstrate 'Find-A-Pest' a partnership model whereby citizens, including Māori groups, and industry representatives both contribute observations and undertake identifications. We combine a mobile-phone-based app, database, and content management system with data linked to iNaturalist NZ. We present data from a 3.5-month period of case studies that assessed the effectiveness at delivering improved general surveillance outcomes.

Installed by 497 users, there were 471 observations of 176 taxa submitted by 74 individuals. In combination citizen and industry identifiers processed 99% of observations with only 1% (5 submissions) forwarded to Biosecurity New Zealand. Citizens' identifications were

29 comprehensive and rapid: 79.4% of submitted observations were identified by citizens with
30 57.3% and 95.4% of these processed within an hour or day, respectively. Citizen identifications
31 were correct 95.5% of the time. Many observations (56.1%) were of high priority species
32 profiled as in app fact sheets.

33 Find-A-Pest demonstrates that general surveillance partnership can effectively distribute
34 identification effort thereby reducing false positive loads within government diagnostics labs.

35 Find-A-pest was stable, robust, and endorsed as fit for purpose by users. Achieving biosecurity
36 outcomes, such as early detection to facilitate eradication, will require a much larger scale
37 participation in Find-A-Pest. We suggest applying Behaviour Change Theory to expand
38 participation across diverse groups in the future.

39

40

41 Keywords: Biosecurity; Passive surveillance; Citizen engagement; Invasive species; Information
42 systems; Phone applications; Crowdsourcing data

43

44

45 Author contribution: SP conceived the project, all authors contributed to stakeholder design.
46 SP/JS designed and analysed case studies. SP wrote manuscript with contributions from all
47 authors.

48

49 Key message:

50

- 51 • Biosecurity surveillance is vital to protect natural, productive, and urban environments from
52 invasive species. General surveillance by the public is an important component of the
53 surveillance system but it can be resource intensive.
- 54 • We co-designed (with government, industry, and Māori) a mobile phone-based general
55 surveillance tool called Find-A-Pest. This involves the public in both the submission and
56 identification of samples.
- 57 • Case studies show that in-app fact sheets concentrated public effort on species of interest.
58 The public, via iNaturalist, were capable of quickly and accurately identify observations.
- 59 • Find-A-Pest has shown that new integrated mobile phone-based apps can effectively
60 support general surveillance outcomes and reduce pressure on government funded
61 surveillance services.

62

63

64 **Introduction**

65 Biosecurity is vitally important to protect natural, productive and urban environments from new
66 invasive pests. As an island nation New Zealand can implement a strict biosecurity system that
67 is not feasible in continental situations. Public contributions to the biosecurity system of New
68 Zealand are fostered by the concept of a 'team of 4.7 million' as part of the Biosecurity 2025
69 strategy (MPI 2016). Pest surveillance is an important activity that contributes positive outcomes
70 at different stages of the biosecurity continuum, i.e., to prevent the entry, establishment, and
71 subsequent spread of invasive species (Hulme 2014). Here we discuss surveillance in the
72 context of the International Plant Protection Convention's (IPPC) surveillance standard (ISPM 6.
73 2018) that defines surveillance activities as either specific or general. *Specific surveillance*
74 (sometimes referred to as active) includes official activities by a National Plant Protection
75 Organisation (NPPO) whereby data is actively gathered about specific pests or pathways of
76 concern over defined periods of time. For example, Biosecurity New Zealand (a business unit of
77 the New Zealand Ministry for Primary Industries with responsibility for biosecurity) conducts 13
78 specific surveillance programmes that target risk taxa or pathways, such as gypsy moth
79 (*Lymantria* spp.) (MPI 2012). *General surveillance* is the process by which information about a
80 pest species (e.g., its presence at a location) is acquired by an NPPO from a variety of sources,
81 e.g., government agencies, research institutions, industry, general public, or
82 published/unpublished literature. Hester and Cacho (2017) go further and describe general
83 surveillance as a continuum with public reports defined as 'passive surveillance', reports from
84 community groups or citizen science groups as 'citizen science', and reports from the primary
85 sector producers or associated intermediaries, such as consultants, as 'general surveillance'.
86 Whilst we appreciate the benefits of segmenting and targeting audiences with appropriate
87 surveillance messaging and tools, here we use the IPPC definition of general surveillance in our
88 description of co-developing a tool, called Find-A-Pest. Hence, we include the passive, citizen
89 science, and general surveillance user groups of Hester and Cacho (2017) within our working
90 definition of general surveillance.

91

92 General surveillance has been adopted in other countries to monitor the spread of a diverse
93 assemblage of recently established high-profile invasive species. Examples include brown
94 marmorated stink bug (*Halyomorpha halys*) (Hancock et al. 2019; Maistrello et al. 2018; Malek
95 et al. 2018), Asian tiger mosquito (*Aedes albopictus*), Rose-ringed parakeet (*Psittacula krameria*)
96 (Vall-Ilosera et al. 2017), Sudden Oak Death (*Phytophthora ramorum*) (Meentemeyer et al.
97 2015), and as well as various pest plants (Gallo and Waitt 2011; Laidlaw et al. 2016) in
98 terrestrial environments. Most projects rely on visual observations by an observer, but some
99 have been highly successful at incorporating sample collection to facilitate molecular
100 identification (Biggs et al. 2015; Meentemeyer et al. 2015; Meyer et al. 2019). Some
101 programmes do not target the public but empower organisational employees to contribute to
102 biosecurity surveillance. These have also proven successful with employee general surveillance
103 effort responsible for 95% of all new organism detections on Barrow Island (Australia) (Thomas
104 et al. 2017).

105 Beyond monitoring established pests, general surveillance supports the detection of new
106 incursions of exotic species to a country or region/state within a country. For example, 25 of 34
107 post-border detections of new forestry pests in Australia were made through general
108 surveillance, seven as the direct result of public reports (Carnegie and Nahrung 2019).

109 Similarly, between July 2005 and June 2008 the general public generated 355 of the 728 exotic
110 organism detections (these do not represent establishments) reported via the Pest and Disease
111 Hotline in New Zealand (Froud et al. 2008). This rate was closely matched in 2008 and 2009
112 where 205 of the 453 reports were from the general public (Froud and Bullians 2010). Clearly a
113 large proportion of new detections are created via general surveillance, however the process is
114 often inefficient. The 355 observations reported between 2005 and 2008 (Froud et al. 2008)
115 represent a 2.4% positive rate from 14,546 reports submitted. New Zealand's NPPO had valid
116 concerns that new technologies that enhanced the efficiency of observation submission could
117 overwhelm their diagnostic resources. Furthermore, there are inherent public reporting biases
118 towards species that are visually distinctive, e.g., large and colourful (Caley et al. 2019). Hence,

119 the value of general surveillance to the overall biosecurity system is context dependent. For
120 example, general surveillance is likely to be more successful for monitoring the spread of a
121 recently established highly distinctive species, but less likely to be successful at detecting a
122 non-descript exotic pest early enough to facilitate eradication. Carnegie and Nahrung (2019)
123 note that most exotic pests or pathogens of trees detected in Australia between 1996 and 2017
124 were detected after the point that eradication could have been contemplated. But, there are also
125 examples where high impact pests reported by the public have led to effective eradication, such
126 as fall webworm (*Hyphantria cunea*) and red imported fire ant (*Solenopsis invicta*) in New
127 Zealand (Froud et al. 2008). Early detection is crucial as it is the most important predictor of
128 eradication success (Brockerhoff et al. 2010). Maximising the beneficial outcomes from general
129 surveillance requires a simple process that both focuses the attention of the observer on high-
130 priority species and reduces the identification burden posed by the high false positive rate of
131 public reporting.

132
133 New Zealand had 4.963 million mobile handset connections to the internet in 2018 (Statistics
134 New Zealand. 2018), more than its resident population which is probably a function of
135 international tourist visitors. Mobile phones can increase the speed and quality of surveillance
136 reporting by automating information transfer to minimise potential user error, e.g., date/time,
137 location, and image are provided by the device (Newman et al. 2012). Many mobile-phone-
138 based general surveillance tools are now available for monitoring the spread of established
139 species or detecting new incursions of exotic species, e.g., bugMap (Malek et al. 2018). When
140 conceptualising Find-A-Pest in 2016 all current biosecurity surveillance applications that we
141 were aware of relied on expert validation of data by the project owner (individual or company).
142 This was a task often delegated to a team of expert diagnosticians, often paid public-sector
143 employees (e.g., Observatree and MyPestGuide™ Reporter) or a closed group of experts (e.g.,
144 iRecord (Roy et al. 2015)). To overcome this challenge we proposed a partnership model (Grant
145 et al. 2019), whereby government, industry and the community contributed to both the
146 submission and validation of observations submitted. A variant of this approach now seems to

147 be considered by others, e.g., Mosquito Alert, who are developing a community identification
148 approach (Palmer et al. 2017).

149
150 Here, we report on the design, development and case-study testing of Find-A-Pest in New
151 Zealand. Find-A-Pest is a biosecurity surveillance tool designed as a partnership between
152 government, industry, and community groups. Its objectives were to test whether mobile phone
153 technology can be used to increase the accuracy, consistency, focus (on high priority invasive
154 species), and eventually the volume, of general surveillance in New Zealand. Importantly we
155 trialled a distributed system of diagnostics to reduce the pressure on professional diagnostic
156 services within New Zealand's NPPO. We report on the outcomes of a series of case studies
157 and evaluate the performance of the tool and feedback from users.

158

159 **Methods**

160 *Find-A-Pest Partnership*

161 Find-A-Pest is a partnership between central and regional government, primary producers, Te
162 Tira Whakamātaki (Māori Biosecurity Network, Māori are the indigenous people of
163 Aotearoa/New Zealand) and iNaturalist NZ, to improve general surveillance reporting (Grant et
164 al. 2019). The partnership increases public and industry participation in biosecurity, which is an
165 aim of the Biosecurity 2025 strategy (MPI 2016). Specifically, primary producers, regional
166 government staff and their contractors, and the public are the target audience to contribute
167 observations of potential biosecurity threats. Furthermore, Find-A-Pest works with citizens and
168 industry representatives to identify these observations at different levels depending on the
169 potential sensitivity of the data. Firstly, Find-A-Pest works in close collaboration with iNaturalist
170 NZ (<https://inaturalist.nz/>) that is an open community of individuals interested in natural history
171 that already contribute and identify biodiversity observations throughout New Zealand.
172 iNaturalist NZ users can view observations that are likely to represent a low biosecurity risk and
173 provide identifications and commentary that are returned via Find-A-Pest to the user. Industry
174 and regional government biosecurity managers contribute by screening observations of

175 unknown or higher priority threats (see below for dataflow). Screening sends suspected
176 positives of high priority threats to Biosecurity New Zealand as the NPPO and low risk
177 observations can be forwarded to the iNaturalist NZ community for further identification. This
178 partnership was designed to reduce the burden on the professional diagnostic services of the
179 NPPO so that higher volume general surveillance could be sustained in the future.

180

181 *Technology of Find-A-Pest*

182 Find-A-Pest is modelled on the concept of a single 'skeleton' for all, that uses different 'content
183 skins' depending on the users' subscription to available sectors within the app. This approach
184 allows delivery of fit for purpose content that meets the information need of a wide variety of
185 stakeholders. Conceptually there are three types of users within Find-A-Pest: 1) site
186 administrators, 2) identifiers, and 3) app users. Site administrators are Find-A-Pest project staff
187 who control the content and dataflow within Find-A-Pest, which includes:

- 188 • Adding species profiles and determining the data flow of any observations submitted via
189 the profile page of a species (see data flow below)
- 190 • Creating and modifying individual sector profiles (e.g., forestry, kiwifruit, weeds) and
191 populating these with relevant species profiles.
- 192 • Creating geographic areas and assigning species profiles so that content reflects
193 regional priorities.
- 194 • Assigning users rights to the identifier website.

195

196 Identifiers from industry have access to an identifier website that is a private website tool for
197 rapid assessment of potential biosecurity risk (see data flow below). Most industry identifiers are
198 biosecurity managers with their respective organisations; they are not taxonomists but have
199 varying levels of domain knowledge about high priority pests relevant to their industry. Users
200 are those that install the Find-A-Pest app and submit observations via their iOS or Android
201 phone. Example screen shots of core Find-A-Pest functionality are shown in Figure 1.

202

203 The core of the Find-A-Pest structure is a Couchbase database that is hosted by Amazon Web
204 Services (Figure 2). The Couchbase is the ultimate repository of observations and app content.
205 A Find-A-Pest user hosts a subset of the database on their phone (in Couchlite) that is updated
206 by a sync gateway when data coverage is available. Couchlite ensures that full offline
207 functionality is available to the user, which was an important consideration of stakeholders who
208 often work in areas with patchy cell phone coverage. Content is created and managed using
209 Directus (<https://directus.io/>) an open source headless Content Management System (CMS).
210 Within Directus a 'content skin' can be created and the fact sheets of species assigned to that
211 'content skin' will be visible to those users that have subscribed to it. Species fact sheets are
212 created in Directus and include an image and text grouped under the following headings:
213 Identification, Habitats, Similar species, Origin, and Damage. Content updates to the user's
214 phone, data transfer between the users and the identifier website, and interactions with
215 iNaturalist NZ, are controlled by an Application Programming Interface (API). Identity and
216 access management are controlled by Keycloak (open source identity and access management
217 software). Conceptually the system is designed to be specific to an individual country to ensure
218 data integrity of potentially sensitive biosecurity observations. Currently deployed in New
219 Zealand, the tool could work in any other country that was happy to work collaboratively with a
220 local iNaturalist node (as we do in New Zealand) or with the iNaturalist global community.

221

222 *Find-A-Pest Dataflow*

223 Users can submit a photo of an observation via three methods; 1) via a species profile page
224 (fact sheet) when they believe they may have seen that particular species, 2) via a blue
225 'camera' button that facilitates submission of photographs of anything seen by the user, or 3) by
226 typing in a species name into a search bar to select from the list of species in the Find-A-Pest
227 system. To guide users on what is most important to report, species profiles are organised into
228 "content skins" of pests specific to the user's region and specified sector(s) or interest (e.g.,
229 forestry, weeds). All users additionally see the 'content skin' for the highest priority pests
230 nationally and for their region. These species are defined by Biosecurity New Zealand and New

231 Zealand's regional councils that have statutory responsibilities for biosecurity at the national and
232 regional scales, respectively. These high priority pest species can be updated in real-time
233 whereby changes (additions, deletions, and modifications) to individual species factsheets or
234 groups of fact sheets (i.e., a 'content skin') in the Directus CMS are immediately visible to the
235 user if they have wifi or cellphone data coverage. This is important to ensure users can be
236 alerted quickly towards new high priority threats that are identified.

237
238 When creating a species profile an administrator determines the dataflow of observations
239 submitted via that species profile. Observations from profiles of new-to-New Zealand species
240 are routed to the Find-A-Pest identifier website for pre-screening, along with unknown
241 observations taken using the 'camera' button. The identifier then has the option to provide an
242 identification and mark the observation as 1) complete and do not forward, 2) forward to
243 iNaturalist NZ for further identification, or 3) send to Biosecurity New Zealand for formal
244 identification. For the case studies (see below), our partner institutions identified 233 high
245 priority pests (including many weeds) for inclusion on the appropriate "content skin" along with a
246 species profile (fact sheet) page. These were a mix of high risk species not established in NZ,
247 new to NZ species, and established but spreading species. Identifiers provide a screening
248 service to filter out obvious biosecurity threats from existing pests and native species. They can
249 provide a species identification or simply tag the observation with a higher rank, e.g., Kingdom,
250 Class, Order etc, to focus the attention of subsequent citizen identifiers on iNaturalist NZ.

251
252 Observations submitted via a species profile of a taxa that is already present in New Zealand
253 are typically routed from the user directly to iNaturalist NZ and do not appear in the Find-A-Pest
254 identifier website. The few exceptions were pest taxa absent from some regions that are of
255 value to some members of the public (e.g. deer, coarse fish). In these cases, regional council
256 biosecurity staff did not want to risk further spread by making new incursions immediately public
257 on iNaturalist NZ. All observations submitted by Find-A-Pest to iNaturalist NZ are automatically
258 placed in the Find-A-Pest observation project (<https://inaturalist.nz/projects/find-a-pest->

259 observations). For potential new incursions to New Zealand, all information collected by Find-A-
260 Pest about an observation is collated into an email and forwarded to Biosecurity New Zealand's
261 Pest and Disease Hotline provider who then integrates the observation into current formal
262 surveillance processes. In all cases, comments and identifications made by Find-A-Pest
263 identifiers and citizen identifiers from iNaturalist NZ appear to the Find-A-Pest user on their app.
264 This includes comments encouraging the user to add additional, more diagnostic photos to
265 confirm an identification. Note: Observations submitted by a user following the link within a
266 factsheet are tagged with that species name as a suggested identification. These initial
267 identifications can be confirmed or updated by a Find-A-Pest identifier or citizen identifier from
268 iNaturalist NZ.

269

270 *Case studies*

271 The availability of Find-A-Pest was restricted to iOS and Android users in New Zealand due to
272 the geographic scope of the project, the relevance of the species included in the "content skins",
273 and the participating identifiers. Find-A-Pest was trialled between February and April 2019 as
274 part of a series of case studies involving the plantation forestry and kiwifruit industries and three
275 local government agencies with an interest in weed surveillance (Northland Regional Council,
276 Auckland Council, and Environment Southland). The format of each case study was designed in
277 conjunction with each of the case study partners (Forestry and Kiwifruit and the general public
278 via regional councils). A brief description of each case study and associated communication
279 activities are provided in supplementary material: Appendix A.

280 Segmenting involved a process of identifying groups within the scope of each case study that
281 scored (low, medium, or high) with respect to access, suitability and motivation to report via
282 Find-A-Pest. Our process aligns with the capability, opportunity, and motivation model (COM-B)
283 developed by Michie et al. (2011). Access was defined as people that were regularly present in
284 areas where observations of potential pests were likely. For example, a field-based employee in
285 a forestry company would be preferred over a desk-based position. Suitability was assessed as
286 individuals/groups that were likely to be regular users of mobile phones or may have one as part

287 of their job. Motivation assessed the importance a user/group might place on biosecurity and
288 the role of surveillance. High motivation was reflected in traits such as biosecurity being a core
289 part of their professional or volunteer work or that they were the owner of a primary production
290 facility, e.g., farm or forest and hence it was in their self-interest to be biosecurity aware. A
291 process of targeting and cultivating relationships was used to define who would partake in each
292 case study and how communications with these groups would be managed. Targeting exercises
293 were undertaken with the stakeholders of each case study group to identify the most relevant
294 participants to include in each case study. An email request was made to all individuals that had
295 submitted at least one observation to solicit feedback via a questionnaire (see Supplementary
296 material: Appendix A) on their experience using Find-A-Pest and to suggest future
297 improvements.

298

299 *Uptake and system performance during case studies*

300 Find-A-Pest was tested with an invite only beta-test group in December 2018 and made publicly
301 available in New Zealand on 12 February 2019 via both the Apple App and Google Play stores
302 to support the case studies. While publicly available, it was only promoted to our small case
303 study communities. There was an almost equal split between Apple and Android users with 497
304 installations of Find-A-Pest (excluding beta testers as they were invited).

305

306 *Analysis of results from case studies*

307 All data collected by the Find-A-Pest app and its identifier website during the case study period
308 was analysed in R (R Development Core Team 2017) alongside all iNaturalist NZ data
309 (comments and identifications on the Find-A-Pest observations) from the same period. The
310 speed and accuracy of identifications were assessed by calculating the time between
311 submission and first identification, and the accuracy of both the first and final consensus
312 identification (on iNaturalist NZ multiple users can contribute identifications to an observation,
313 producing a consensus “community ID”). The accuracy of final identifications was assessed by
314 the authors (SMP for invertebrates, JJS for plants and vertebrates). The fungal observations

315 were identified on iNaturalist NZ by a volunteer user who is a professional mycologist and
316 recognised New Zealand expert. Find-A-Pest identifications (user ID, initial ID, and consensus
317 ID) were considered correct if they were the same taxon, at the taxonomic level appropriate for
318 the provided photographic evidence. Identifications at a correct higher taxonomic level (e.g., a
319 correct genus ID for a species), or a plausible lower taxonomic level (e.g., a plausible species
320 ID when the photo only supports the genus), were separated from incorrect identifications. The
321 summary of observations by New Zealand biostatus (endemic, non-endemic indigenous,
322 naturalised) used the biostatus provided by the New Zealand Organisms Register
323 (<http://nzor.org.nz/>).

324

325 **Results**

326

327 *Outcomes from case studies*

328 In total 471 observations were submitted by 74 users (excluding observations made by the
329 authors and developers) during the case study period (20 December 2018 to 4 June 2019).
330 Observation submissions were dominated by plants (78.9%) with insects, mammals, arachnids
331 and fungi represented by 14.3, 4.1, 0.5, and 0.5% respectively (1.7% were other
332 animal/pathogen groups and one unidentifiable photo). User observations were automatically
333 passed to the Find-A-Pest project on iNaturalist NZ 63% of the time, pre-screened by the Find-
334 A-Pest identifier website before forwarding to iNaturalist NZ for further identifications 33% of the
335 time, and pre-screened and retained in the Find-A-Pest identifier website 3%, or forwarded to
336 Biosecurity New Zealand 1%. The latter comprised five observations, which included one
337 *Cermatulus nasalis* (a native stink bug that superficially resembles *Halyomorpha halys* (brown
338 marmorated stink bug)), one *Monistria?* sp. (a grasshopper found dead in imported grapes), and
339 three exotic species that were already established in New Zealand. These were an observation
340 of a larva found in a peach (suspected to be *Coscinoptycha improbana* (Australian guava
341 moth)), a *Harmonia axyridis* (Harlequin ladybird beetle, first detected in NZ in 2016), and
342 *Abutilon theophrasti* (Velvet leaf, the subject of a 2016 biosecurity incursion response in NZ).

343

344 Users suggested an identification for 63.9% of the observations they submitted. By the end of
345 the case studies, the iNaturalist NZ community had provided identifications for 79.4% of the
346 observations that had been forwarded to iNaturalist NZ. Comments were made in addition to
347 identifications on 17.5% of these observations and 2.2% received comments from iNaturalist NZ
348 users but no identification. In cases where the iNaturalist NZ community moderated an
349 identification provided by the user, this was confirmed 86.0% of the time and corrected or
350 improved 14% of the time. Of those observations that received an identification, more than half
351 (57.3%) of observations submitted received their first identification by iNaturalist NZ within one
352 hour of submission and 95.4% of observations within 24 hours (Figure 4). Many (34.6%) of
353 observations forwarded to iNaturalist NZ received two or more identifications (Figure 5). Of the
354 Find-A-Pest observations identified on iNaturalist NZ, their consensus (“community”)
355 identifications were 85.6% at a species level, a further 7.8% at the subgenus or genus level,
356 2.8% at the subfamily or family level, and the remaining 3.9% at higher taxonomic levels.

357

358 There were 176 taxa recorded during the case studies using Find-A-Pest, 136 of which were
359 identified to species or below. Of these, 54 were of high priority species selected by our partner
360 institutions to include as species profile pages on the Find-A-Pest app as part of the different
361 “content skins”. A majority of observations (56.1%) submitted by Find-A-Pest users were
362 confirmed to be one these high priority pest species. Of the 176 unique taxa recorded, 147
363 (representing 456 of the observations) could be unambiguously categorised as introduced or
364 indigenous to New Zealand. Of these, 75.5% of the identified taxa, from 78.5% of the
365 observations, were of introduced species that were already established in New Zealand.

366

367 We manually assessed the identification accuracy of all Find-A-Pest observations submitted to
368 and subsequently identified on iNaturalist NZ. The great majority (95.5%) were completely
369 correct. Of those correctly identified observations, 92.9% were identified at the species level,
370 5.0% at the genus level, and 1.2% at the subfamily or family level (the remainder were at higher

371 levels, usually due to low quality submitted photos). Of the incorrectly identified observations, 15
372 were identifications correct at the genus level, but the species identifications given, while
373 plausible, were not possible to confirm with the submitted photos. Another two observations had
374 plausibly correct species or genus identifications with comments specifying that they could
375 otherwise be relatives in another genus. One citizen identified observation was the wrong
376 species in the correct genus (identified as *Buddleja davidii* but was another *Buddleja* species),
377 and another was the wrong species in the correct tribe (identified as *Carduus nutans* but was
378 another thistle, *Cirsium vulgare*). Importantly, only one observation had completely the wrong ID
379 (a vegetative weed tentatively identified by one citizen identifier as *Viola odorata* but likely to be
380 *Petasites fragrans*).

381

382 *Feedback from users*

383 The feedback survey was completed by 55 of the 74 people that submitted observations. Two
384 responses were clearly attempts to obfuscate the purposes of the survey and were removed
385 prior to summarising the results. The majority (71%) of respondents agreed/strongly agreed that
386 Find-A-Pest was easy to use with 10% disagreeing with this statement and one individual
387 strongly disagreeing (Figure 6). Most users (66%) agreed or strongly agreed that the ability to
388 focus on pests relevant to their sector of interest or region was useful with 12% disagreeing with
389 this statement (Figure 6). Similarly, 65% of users agreed/strongly agreed that Find-A-Pest was
390 useful for learning about important pests (Figure 6). The ability to submit random observation of
391 any species using the blue camera button deemed useful to 79% of respondents (Figure 7).
392 Many respondents (64%) indicated they would not have submitted their observation to
393 Biosecurity New Zealand if Find-A-Pest was not available (Figure 7). Feedback from Find-A-
394 Pest (via industry identifiers or the iNaturalist NZ community of identifiers) did encourage 54%
395 of respondents to submit additional observations (Figure 7). Most (75%) of industry identifiers
396 found the tools for processing observations in the Find-A-Pest identification systems to be
397 suitable for their needs (Figure 7).

398

399 All of the six improvements suggested by the survey (see Supplementary material: Appendix A)
400 were considered to be either essential or somewhat essential by at least 84% of respondents
401 with three improvements having 98% support (Figure 8). The functionality deemed most
402 essential was the ability to receive alerts via the app of new biosecurity incursions. The
403 suggested improvement that had the highest non-essential rating (still thought non-essential by
404 only 16% of respondents) was the ability to reply to comments on observations directly from
405 within the Find-A-Pest app.

406
407 Not all survey respondents completed the demographic section, however of those that did there
408 was little ethnic diversity with 48 people identifying as NZ European or European and one as
409 Māori (Figure 9). There was greater diversity in the age of respondents with relatively even
410 participation between those aged 20 to 50 years and lower participation in older age cohorts
411 (Figure 9). Most (84%) respondents had a tertiary qualification, with 34% working for a
412 government agency, 28% within the primary sectors, 30% indicating a general interest in
413 biosecurity and 12% identifying as self-employed (Figure 9). Most survey respondents did not
414 live in a major urban centre with 50% from regional towns, 30% identifying as rural, and a
415 combined 20% from Auckland, Wellington, and Christchurch (Figure 9).

416

417 **Discussion**

418

419 General surveillance is one of the various channels of intelligence gathering of the National
420 Plant Protection Organisation (NPPO). To increase the scale (and potential success) of general
421 surveillance without overwhelming NPPO resources requires the distribution of effort. Our
422 approach to this is to incorporate citizens (via iNaturalist NZ) and industry representatives in the
423 screening process for observations submitted. This approach reduced the number of false
424 positives received by NPPO diagnosticians and an overall improvement in the quality of reports
425 was achieved by targeting user attention via in-app factsheets.

426

427 *Scale: Reducing the number of false positives received by an NPPO?*

428 Our screening approach was very successful and reduced the identification burden on the
429 official diagnostic service of Biosecurity New Zealand to just 1.1% of observations submitted to
430 Find-A-Pest. This differentiates us from most other mobile-phone-based general surveillance
431 initiatives where citizen involvement is limited to the role of observers/reporters or a closed
432 group of invited 'experts'. We implemented a tiered approach where an open community of
433 volunteer citizen identifiers (via iNaturalist NZ) screen low-risk reports of species known to be
434 present in New Zealand. Such reports were submitted via the pest profile within Find-A-Pest,
435 hence observers had self-identified an initial diagnosis that the citizen identifiers could then
436 review. Such species profiles were included as educational material to improve user knowledge
437 about current pests. Find-A-Pest identifiers were members of the primary sectors or regional
438 councils with biosecurity training. They screened the unknown observations that were submitted
439 from the generic camera button or potentially higher-risk observations submitted from a fact
440 sheet of a species not present in New Zealand. iNaturalist NZ was critical to the success of this
441 process. In particular, its open membership represents a broad and largely self-sustaining
442 community of interest with experts in all domains of life, e.g., fungi, insects and plants, hence
443 they provide expertise for the full range of observations submitted. Hence, they were an ideal
444 partner to assist observers who have limited taxonomic knowledge or only knowledge in specific
445 taxonomic domains that wanted to participate in biosecurity by reporting a broader range of
446 potential threats. The iNaturalist NZ community self-moderates and thus a consensus of opinion
447 can be reached amongst multiple observers. Furthermore, the open nature of the iNaturalist NZ
448 platform with the contribution of comments and identification is an ideal method to gradually
449 increase the collective identification skills of all participants.

450
451 Citizen identifiers responded to observations very quickly with the majority of observations that
452 received an identification doing so within 24 hours. The validation exercise indicated that
453 accuracy was also high (95.5%) with only one observation indicating a completely wrong
454 identification. However, identification errors on iNaturalist NZ are often discovered by others at a

455 future date and corrected by the user community over time. Hence, our identification error
456 estimates from citizen identifiers here will be conservative and long-term future
457 comments/identifications will flow from iNaturalist NZ into Find-A-Pest. Identification accuracy
458 was impressive given that they were based solely on submitted images and that no original
459 specimens were provided for analysis. The speed and accuracy of identifications underscored
460 both the knowledge of the citizen identifiers and the skill of Find-A-Pest users that were
461 supplying images suitable for a diagnosis. This can be difficult for small, obscure taxa, e.g.,
462 insects, however with time and encouragement it is hoped that regular users will improve their
463 photography skills further allowing for an increase in the identification rate. In the few cases
464 where citizen identification was uncertain it was either because species identification was not
465 possible for an insect larval stage (<https://inaturalist.nz/observations/25137030>) or that the
466 image did not illustrate a key diagnostic feature or was of insufficient quality
467 (<https://inaturalist.nz/observations/25927144>). Hence, Find-A-Pest users would benefit from
468 feedback through the app to encourage better image capture.

469
470 Identifications were only provided by citizen identifiers for 79.4% of observations submitted. To
471 achieve 100% coverage of identifications would therefore require some investment in additional
472 diagnostic services, i.e., paid staff to identify observations not dealt with by citizen/industry
473 identifiers. One potential long-term risk of incorporating citizen identifiers is fatigue whereby
474 volunteers stop identifying observations as they feel their contribution is undervalued. We
475 cannot ascertain the extent of this potential issue as part of our current project, however
476 maintaining motivation and avoiding volunteer fatigue is a known risk for citizen-based projects
477 (Deutsch and Ruiz-Córdova 2015). Despite this we note that iNaturalist NZ has been running
478 since 2012 and has developed a large, sustained community of identifiers that are identifying
479 without any explicit institutional encouragement or feedback. That's not to say that Find-A-Pest
480 would not get more engagement from identifiers if there was some form of encouragement.

481

482 *Improving the quality of general surveillance reporting*

483 There are clear biases in the type of organisms that initiate the submission of a voluntary
484 observation as part of biosecurity reporting. Organisms that are large, distinctive/colourful are
485 known to be over reported (Caley et al. 2019), yet many biosecurity threats do not fit such
486 categories. It may be possible to use these initial submissions of distinctive low priority species
487 as a point of engagement that may result in longer-term interactions whereby a motivated group
488 can be encouraged to report additional specific threats.

489 Our approach to improve the quality of general surveillance reporting focussed on the provision
490 of factsheets within Find-A-Pest that aim to focus the users' attention on high priority invasive
491 species. Factsheets included a mixture of high-priority pests species that are not present in New
492 Zealand (e.g., species from Biosecurity New Zealand's priority pest and disease list (Biosecurity
493 New Zealand. 2019)), total control weeds from regional council pest management plans, and a
494 range of relatively wide spread common pests that affect crops of primary industry stakeholders.
495 The inclusion of the latter was to enhance user knowledge of current pests such that they could
496 distinguish these from invasive species not currently present in New Zealand. Over time,
497 knowledge gained, should reduce the false positive surveillance rate of reporting common
498 existing pest species. Furthermore, encouraging such observations may identify new host
499 associations or distributions that are relevant to other aspects of biosecurity, e.g., long-term
500 pest management (Froud et al. 2008). The Find-A-Pest case studies included profiles of 233
501 species. The majority (56.1%) of observations submitted during the case study period were
502 species for which Find-A-Pest included a species profile. This suggests that our approach is
503 effective at targeting user attention to species that are of most relevance to those that manage
504 invasive species. Find-A-Pest does not currently include a messaging service to inform users
505 about new invasive species threats in real-time. This functionality was ranked by users as an
506 essential item for further development and is an obvious extension to the species profiles as a
507 method for targeting user effort at high priority species.

508

509 *Promoting wide-spread adoption*

510 A biosecurity team of 4.7 Million is the catch phrase of Biosecurity New Zealand's current ten
511 year strategy that wants all New Zealanders to do their bit for biosecurity (MPI 2016). Clearly
512 the identification capacities within Find-A-Pest would be overwhelmed at such a scale, however
513 greater participation is required to improve the odds that new organisms will be detected within
514 the early stage of the invasion curve when eradication is possible. Past experience of general
515 surveillance indicates that early detection does occur (Froud et al. 2008), but does not occur as
516 frequently as we would like (Carnegie and Nahrung 2019). Looking forward, Find-A-Pest now
517 needs to engage with behaviour change specialists to understand both the motivations that
518 underpin general surveillance reporting.

519

520 *User feedback*

521 Survey respondents were generally supportive of Find-A-Pest with the majority agreeing or
522 strongly agreeing with statements that the app was easy to use, useful for learning about pests,
523 and that it was useful to focus on pests of interest to their region or sector. Being able to simply
524 send random photos via the phone camera was seen as highly useful. The Find-A-Pest survey
525 of respondents found that 54% indicated that feedback was influential and encouraged further
526 reporting. Others have also found that feedback on the quality of citizen contributions and how
527 such efforts contribute to project outcomes is an important motivational factor that influences
528 on-going participation (Baruch et al. 2016). A more thorough survey of motivations after Find-A-
529 Pest has been operational for a longer period would be beneficial, however the work to date
530 indicates that feedback is a potentially important motivator to users and further work should look
531 to ascertain what type of feedback is most important to users.

532

533 Case studies have shown that Find-A-Pest encourages wider and more engaged participation in
534 biosecurity surveillance and that feedback is an important component when building
535 engagement. This shows that Find-A-Pest has the potential to play an important complementary
536 role to the hotline by providing an avenue to collect additional surveillance data. Most
537 participants indicated that they would not have reported the observation directly to Biosecurity

538 NZ via the national pest and disease hotline. The survey did not explore the rationale for why
539 people would not have reported in the absence of Find-A-Pest. In part, this may have resulted
540 from the large number of pest plant observations that were of species already present in New
541 Zealand but formally controlled by regional government agencies. Hence, observers submitting
542 such records are providing excellent surveillance information, but this is not relevant to
543 Biosecurity NZ that manage the national Pest and Disease Hotline.

544

545 **Conclusions**

546 General surveillance is an important component of any national surveillance system, however
547 reports often occur once a species has established beyond the point where eradication is
548 feasible. Improving the scale and quality of general surveillance reports is likely to improve
549 options for eradication. Find-A-Pest is a new information and communication tool that
550 incorporates citizens and industry representatives as both observers and identifiers of
551 biosecurity threats. Our approach reduced the burden of identifying false positives by
552 professional diagnosticians at the NPPO and encouraged reporting by observers that would not
553 have engaged (for reasons as yet unknown) via existing communication channels. Our case
554 studies have shown that our approach can increase the efficiency of general surveillance and
555 over time may contribute to improved early detection as engagement builds. However, Find-A-
556 Pest will only result in improved general surveillance outcomes if there is strong engagement
557 and uptake of the tool by users. This is often a challenge for new technologies – how to
558 encourage adoption. The Behaviour Change Wheel developed by Michie et al. (2011) has been
559 proposed by McLeod et al. (2015) as an appropriate behaviour change system that incorporates
560 a Capability, Opportunity, Motivation - Behaviour (COM-B) approach to improve adoption of new
561 biosecurity practices and thus achieve desired outcomes amongst communities of interest. We
562 believe that there is benefit in applying such behaviour change science to ensure the long-term
563 delivery of this tool results in strong engagement across a broad cross-section of target
564 audiences.

565

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583

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677

678

679

680 **Figure captions**

681

682 Figure 1. Screenshots from the Find-A-Pest app. The left screen shows part of the "content
683 skin" highlighting the highest priority weeds in the Canterbury region of New Zealand. From this
684 screen, users can also access galleries of the highest priority national and regional pests, and
685 switch between different sectors that they have joined. The second screen from the left shows
686 the top of the species profile page for the wetland weed, purple loosestrife (*Lythrum salicaria*).
687 Second from right is the observation submission screen, in this example taking a photo of a
688 suspected purple loosestrife plant after using the "Report This Pest" button from the species
689 profile page. Users can select to use multiple photos and can either take photos or choose them
690 from their photo library. The coordinates of observations can be obscured with the toggle switch
691 to hide the exact location from public view if shared on iNaturalist NZ. The right screen is the
692 Activity screen. Selecting an observation here displays a page with the identifications(s) and
693 comment(s), sourced from iNaturalist NZ, Find-A-Pest identifiers, or Biosecurity NZ diagnostics
694 staff (depending on the species).

695

696 Figure 2. Overview of the components of the system designed by Cucumber (design and
697 software company based in Tauranga, New Zealand) to run Find-A-Pest. API = Application
698 Programming Interface, CMS = Content Management System, RDB = Relational Database,
699 Keycloak is an authentication service that allows Find-A-Pest to anonymously store user
700 credentials.

701

702 Figure 3. Number of app units downloaded from the Apple store and number of active app
703 installations from Android Play store during the case study period from 12 February to end of
704 May 2019. For the Apple store this includes all first-time downloads of Find-A-Pest but does not
705 include app updates, multiple downloads from the same Apple ID, and redownloads to the same
706 device.

707
708 Figure 4. Time in hours before the first identification provided by iNaturalist NZ users. Most
709 (95.4%) observations were identified in the first day, however the inset shows the extended
710 identification tail with time in days to the first identification with Y-axis truncated to values $\leq 5\%$ of
711 observations.

712
713 Figure 5. Percentage of observations with, Top) Number of identifications, and Bottom) Number
714 of comments from iNaturalist NZ users.

715
716 Figure 6. Percentage of respondents (total 54) that agree or disagree with the following
717 statements. Q1) Do you find it useful that the app focuses on just the pests relevant to your
718 region and area(s) of interest? Q2) The Find-A-Pest app was a useful way to learn about the
719 most important pests to look for in your area and interests, and Q3) The Find-A-Pest app was
720 easy to use.

721
722 Figure 7. Percentage respondents indicating yes or no to the statements. Q1) Did you find the
723 blue camera icon a useful and quick way to take a photo for anything you didn't know?
724 (respondents 49), Q2) If Find-A-Pest wasn't available, do you think you would have reported
725 your observations via the Biosecurity New Zealand 0800 pest hot line? (respondents 52) Q3)
726 Did the feedback you received via Find-A-Pest encourage you to make multiple reports?
727 (respondents 48) Q4) Was the Find-A-Pest Identifier website suitable for you to process and
728 identify the observations submitted from your sector? (respondents 18).

729
730 Figure 8: Percentage of respondents who ranked the importance of the following potential
731 developments of Find-A-Pest in the future as essential, somewhat essential or not essential.
732 Q1) Instant identification suggestions using computer vision machine learning, Q2) Ability to
733 reply to comments made by identifiers directly from the Find-A-Pest app, Q3) Alerts of new
734 biosecurity incursions as notifications on your phone, Q4) News of biosecurity discoveries and

735 events relevant to your area and interests, Q5) See a map of all observations of pests made
736 near you, and Q6) Automatic suggests of what to look for based on the current location of your
737 phone

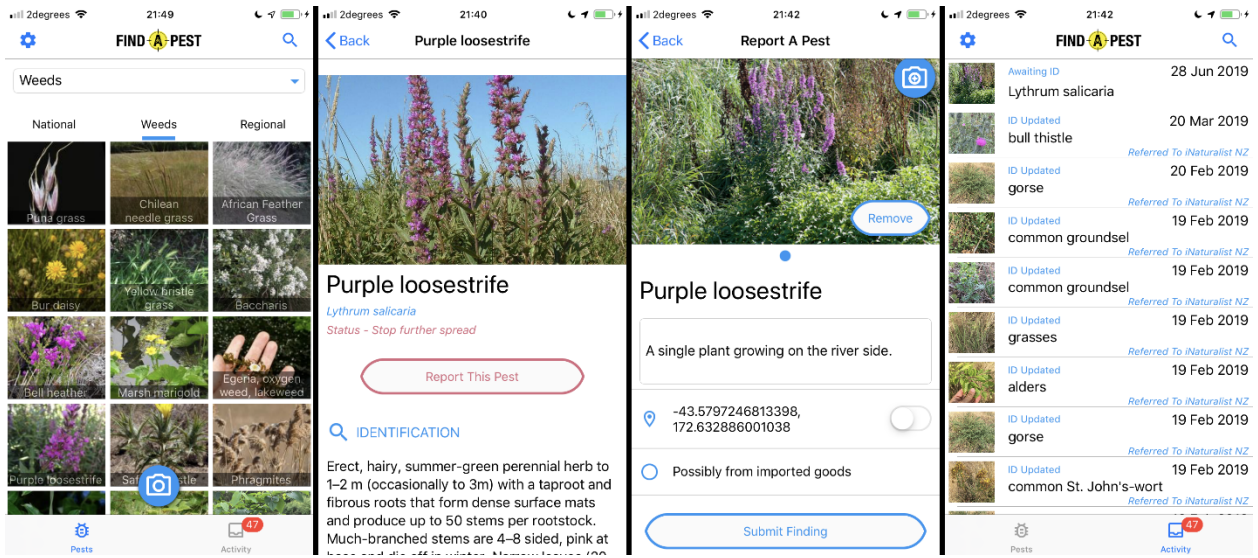
738

739 Figure 9. Demographics of users that responded to survey. Respondents varied between
740 question, age and ethnicity = 49, education, employment, and place of residence = 50.

741

742 **Figures**

743

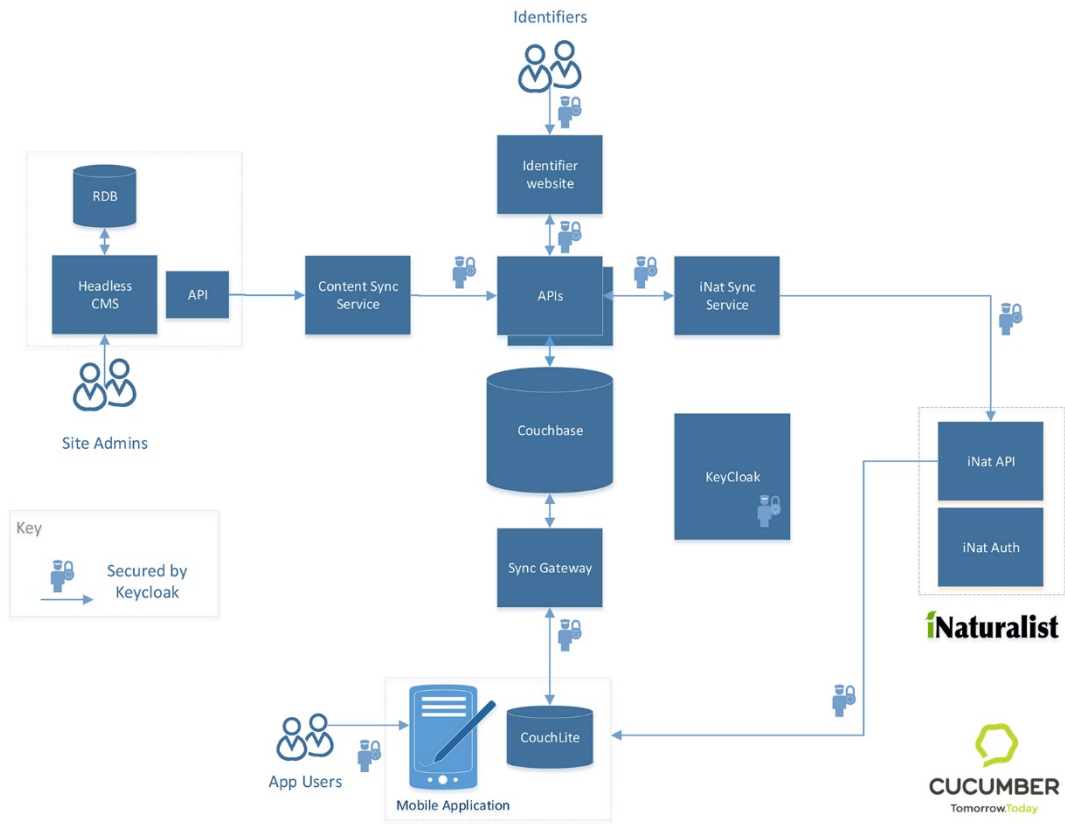


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Figure 1.

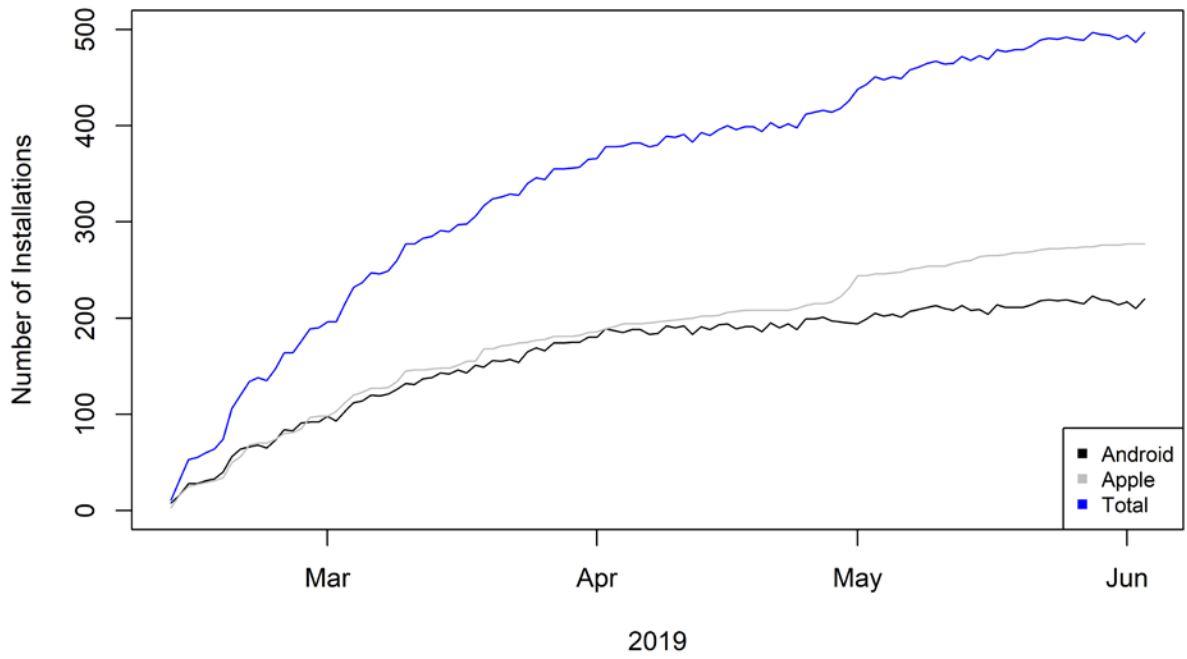
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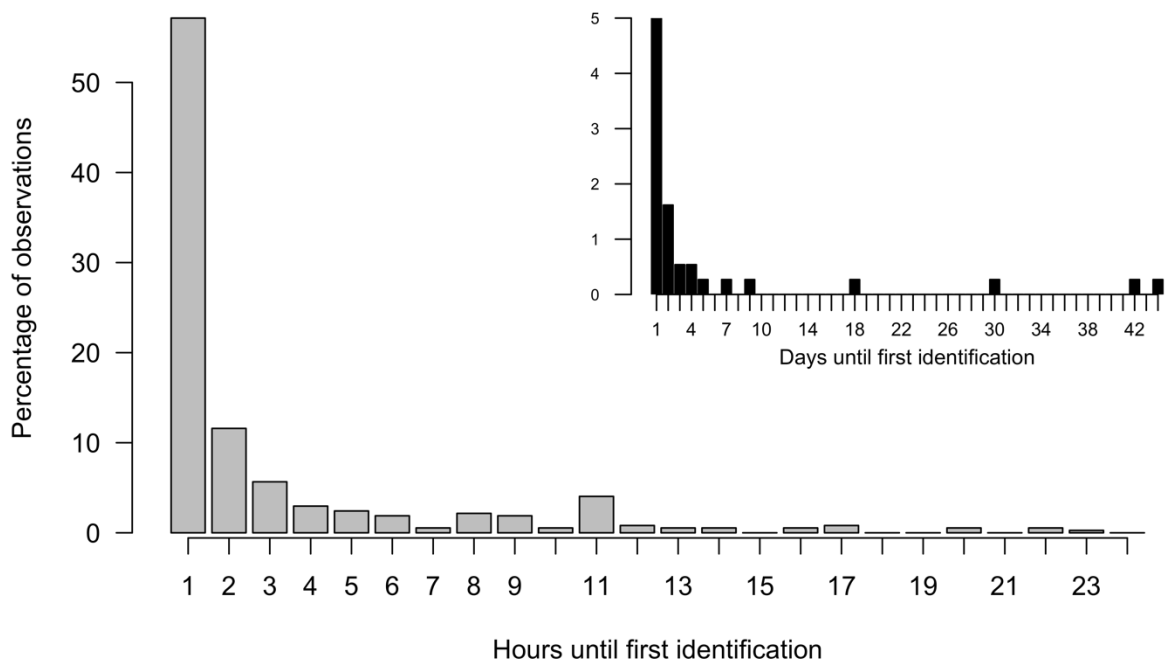
Figure 2.



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750

Figure 3.

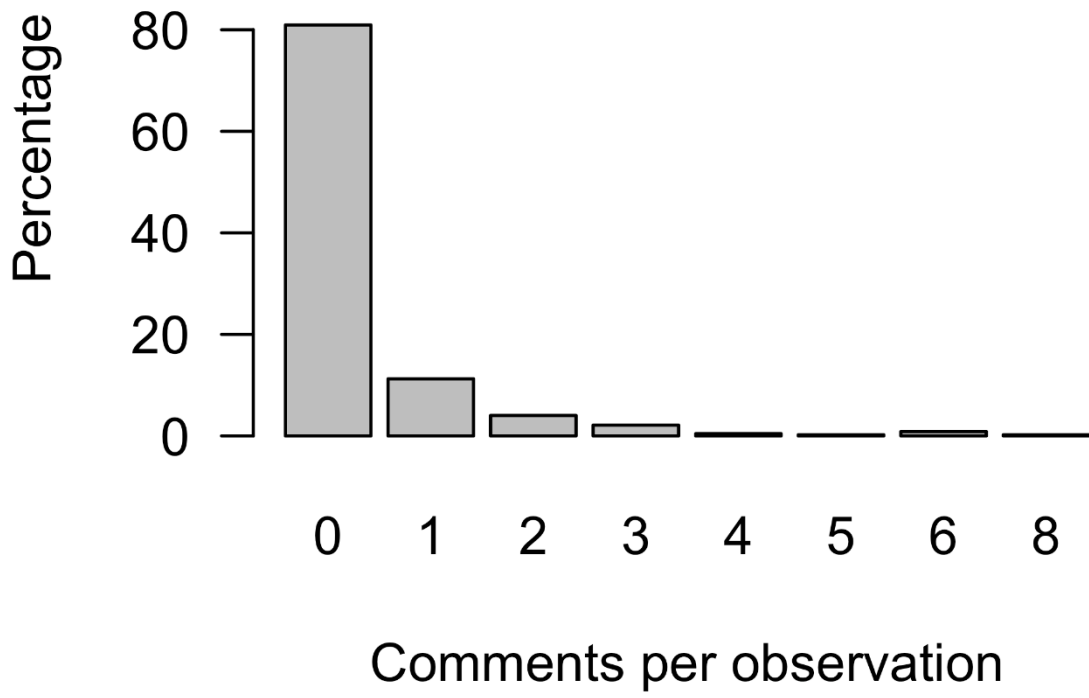
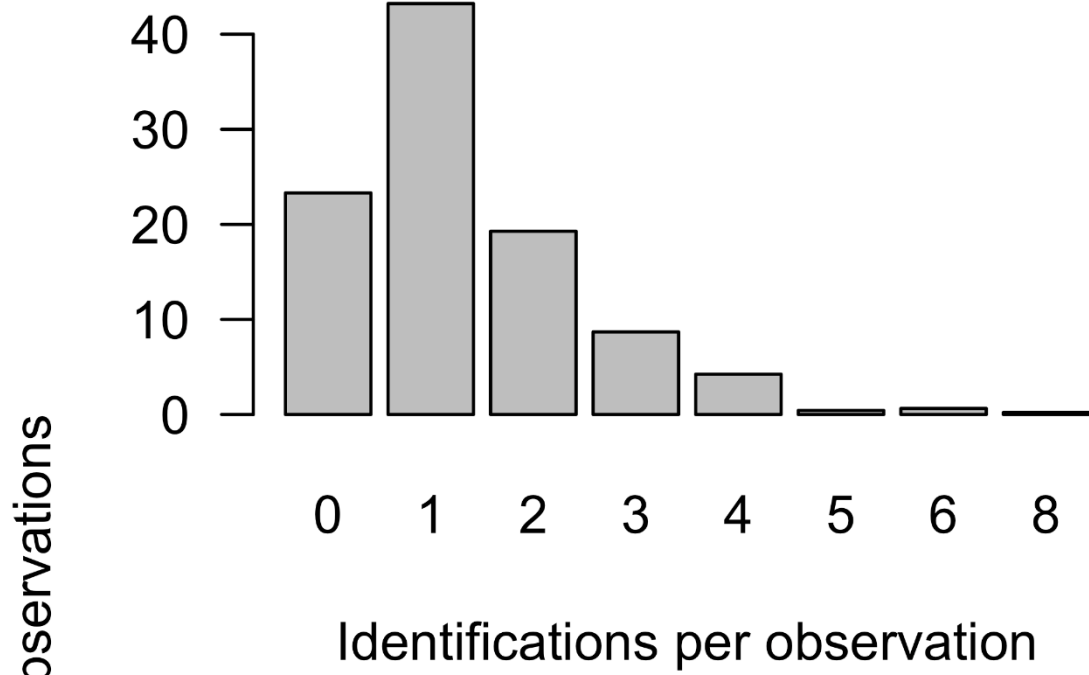


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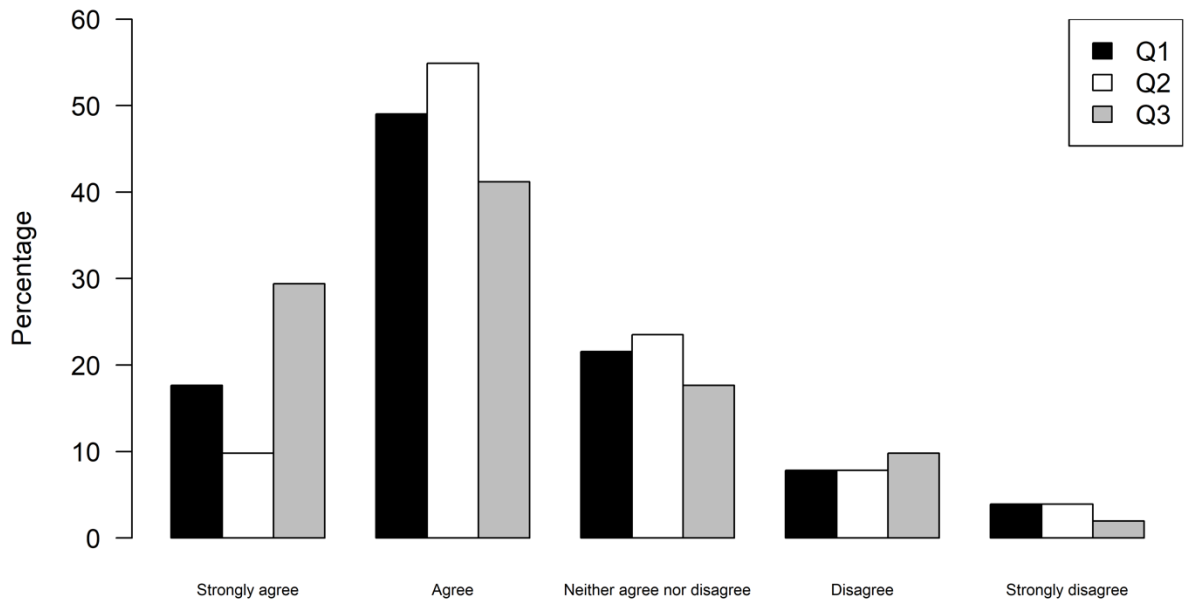
Figure 4.



754

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Figure 5.

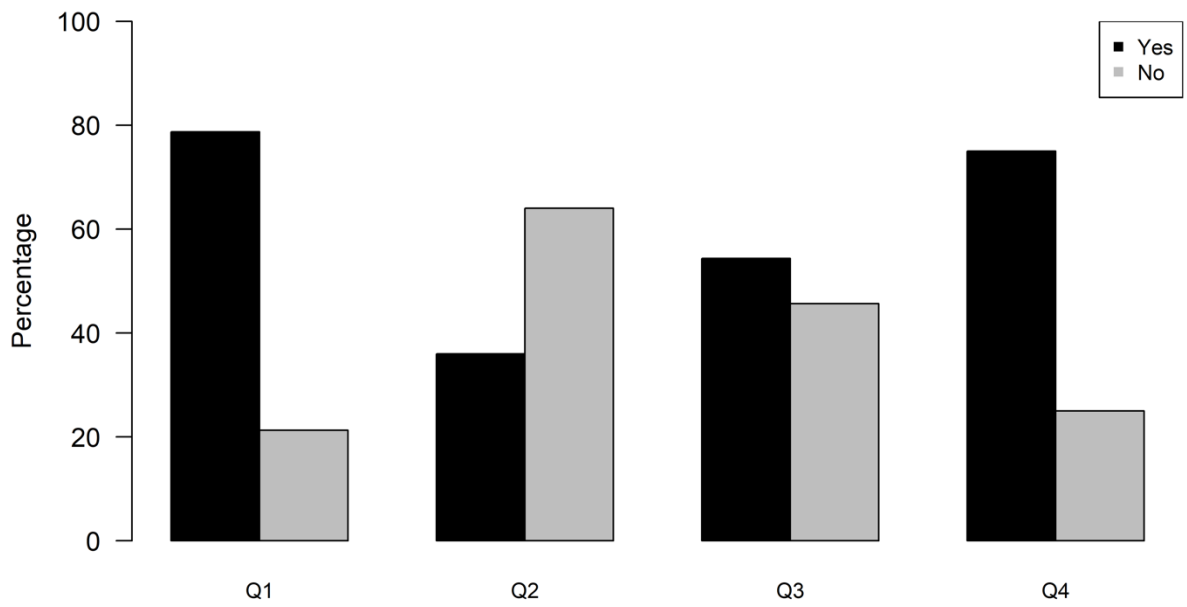


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Figure 6.

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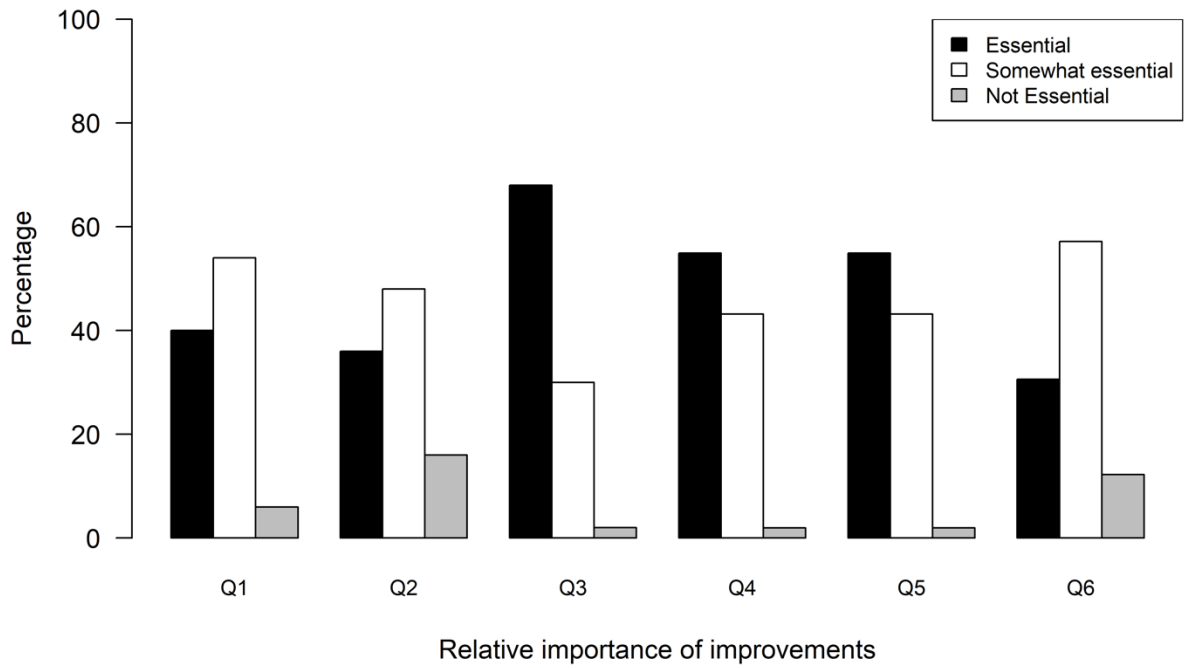
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Figure 7.

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Figure 8.



768
769

Figure 9.

770 **Supplementary material**

771 **Appendix A: Case studies**

772
773 A series of five case-studies of varying intensity was undertaken with different user groups
774 between 12 February and 30 May. These were:

775
776 *Forestry*

777 Forestry case studies included communications targeted at range of different participants within
778 the industry. All members of the New Zealand Forest Biosecurity Committee (FBC) received an
779 email with accompanying Find-A-Pest 'how to guide'. A Find-A-Pest tutorial that explained the
780 tool and provided an identification workshop with example pests and pathogens was delivered
781 to the FBC annual workshop. All coordinators of the PineNet, forest biosecurity network was
782 emailed an introductory letter and the 'how to guide' to pass on to their members. These emails
783 were then followed up by an in-person phone call to answer questions. All branch secretaries of
784 the New Zealand Farm Forestry Association received a postal letter with the 'how to guide'. Half
785 of the branches were selected at random for follow up phone calls with a in person visit to a
786 weekend field day of the North Canterbury branch of the society to discuss Find-A-Pest. The
787 app was also profiled in the February newsletter of the NZ Farm Forestry Association. Finally,
788 all forestry offices receiving the NZ Farm Owners Association (NZFOA, corporate forestry
789 companies) received two copies of the 'how to guide' as part of the March NZFOA newsletter
790 mail out.

791
792 *Kiwifruit*

793
794 The case study was run by Kiwifruit Vine Health (KVH) that is an industry body responsible for
795 biosecurity for the kiwifruit industry in New Zealand. As part of the case study KVH undertook
796 the following activities. An article highlighting Find-A-Pest was emailed to 2500 growers in
797 February. Find-A-Pest was highlighted in the kiwifruit industry magazine in the April issue. A 9-

798 minute podcast promoted Find-A-Pest to KVH members. The 'how to guide' was emailed to the
799 Zespri Orchard Productivity staff that provide advice to growers. Find-A-Pest information was
800 emailed to KiwiNet members that are biosecurity champions within the industry. Lastly the 'how
801 to guide' with Find-A-Pest information was emailed to post harvest growers services staff that
802 provide advice to parts of the kiwifruit industry.

803

804 *Northland Regional Council*

805 Northland Regional Council biosecurity staff were involved in the co-design of Find-A-Pest and
806 invited to test out the app during the case study period. Unanticipated staff changes at the
807 council during this time reduced the level of council involvement in Find-A-Pest testing.

808 Northland Regional Council connected us with Reconnecting Northland, a community group
809 focused connecting the land, the people, and their wellbeing. Reconnecting Northland works
810 with nature-focused community groups throughout Northland to facilitate nature restoration. Two
811 emails about Find-A-Pest were sent out by Reconnecting Northland ecologist Gary Bramley to
812 all participating community groups, one before and one after their West Coast Hui (meeting) on
813 1 April. One of us (JJS) also presented Find-A-Pest at the West Coast Hui, generously hosted
814 by the Omanaia Marae in Hokianga Harbor. There were 35 people in attendance, plus
815 additional members of the marae that joined throughout the day. This included staff and
816 governance from Reconnecting Northland, staff from Northland Regional Council and
817 Department of Conservation, local community members, staff from Unitec (an Auckland-based
818 university), and various iwi representatives. Gary was also provided with Find-A-Pest pamphlets
819 to distribute to community groups.

820

821 *Auckland Council*

822

823 A small-scale case study was run in Auckland where the 'how to guide' was distributed to staff
824 from the biodiversity and parks groups that evaluated Find-A-Pest. It was also demonstrated at
825 the councils February Pest Liaison Group meeting where the 'how to guide' was distributed to

826 participants that included, council staff, council contractors and consultants that work in the
827 areas of biodiversity and biosecurity, and representatives from a wide range of community
828 groups.

829

830 *Southland Regional Council*

831 The case study run in collaboration with Environment Southland (the Southland Regional
832 Council) was focused on a community group on Stewart Island (Rakiura), the Stewart Island
833 Rakiura Community Environment Trust (SIRCET). This trust has for many years led indigenous
834 vegetation restoration and pest and weed control in and around Oban, the only town on Stewart
835 Island. The SIRCET and the wider Oban community were suggested by Environment Southland
836 as a suitable small community in which to trial Find-A-Pest. We worked with SIRCET pest
837 manager Willie Gamble to engage with SIRCET members and the wider Oban community. This
838 included two visits by Find-A-Pest project members to demonstrate the Find-A-Pest app and
839 identifier web tool to Willie and SIRCET members, and regular video conferences and emails
840 between with Willie to coordinate activities and respond to feedback. Willie thoroughly tested
841 the app and encouraged SIRCET volunteers to use the app. This was done in person at
842 SIRCET's community events, in hard copy with our printed pamphlets, and via their Facebook
843 page and email list. We also posted a story on Find-A-Pest in the Stewart Island News
844 (community newspaper), introducing Find-A-Pest and advertising a Find-A-Pest community
845 event and BBQ (held on 27 April). Willie also tested out Find-A-Pest with approximately 20
846 students of Oban's Halfmoon Bay School.

847

848 *Feedback survey*

849

850 Every user of Find-A-Pest that submitted one or more observations during the study period was
851 sent an email asking them to participate in a post case study feedback questionnaire.

852 Participants used survey monkey to participate in the questionnaire (see below) with a follow-up
853 email to all participants thanking those that had already participated and reminding others that

854 the survey was closing soon. Data was processed by the authors, individual responses were
855 anonymous unless the participant chose to disclose their email address to receive additional
856 feedback.

857

858

859 Questionnaire

860 1. Do you find it useful that the app focuses on just the pests relevant to your region and
861 area(s) of interest?

862 2. The Find-A-Pest app a useful way to learn about the most important pests to look for in
863 your area and interests?

864 3. The Find-A-Pest app easy to use?

865 4. Did you find the blue camera icon a useful and quick way to take a photo for anything
866 you didn't know? (yes/no)

867 5. New features are planned for Find-A-Pest. We're interested in which you think are most
868 important.

869 a. Instant identification suggestions using computer vision machine learning

870 b. Ability to reply to comments made by identifiers directly from the Find-A-Pest app

871 c. Alerts of new biosecurity incursions as notifications on your phone

872 d. News of biosecurity discoveries and events relevant to your area and interests

873 e. See a map of all observations of pests made near you

874 f. Automatic suggests of what to look for based on the current location of your
875 phone.

876 6. Did you encounter any bugs in the app (crashes, malfunctioning features)? If so please
877 describe the issue and please include as much information about your phone and its
878 operating system as you can (e.g., iPhone SE with iOS 12).

879 7. If Find-A-Pest wasn't available, do you think you would have reported your observations
880 via the Biosecurity New Zealand 0800 pest hot line? (yes/no).

- 881 8. Did the feedback you received via Find-A-Pest encourage you to make multiple reports?
882 (yes/no)
- 883 9. Were you invited to be a Find-A-Pest identifier (Yes/No)
- 884 a. If 'yes', was the Find-A-Pest Identifier website suitable for you to process and
885 identify the observations submitted from your sector?
- 886 b. How could the Find-A-Pest Identifier website be improved to make it more
887 efficient to process observations?
- 888 10. Demographic questions
- 889 a. Age
- 890 b. Ethnicity
- 891 c. Highest level of education
- 892 d. Where do you live.
- 893 e. What area of employment describes your job.
- 894

895 Notes:

- 896 • Participants were asked to assess questions 1 to 3 on a scale from strongly agree,
897 agree, neutral, disagree, or strongly disagree
- 898 • Participants were asked to assess each item in question 5 as essential, somewhat
899 essential, or not at all essential.
- 900 • Two survey responses were removed as they were clearly malicious in intent with 100%
901 negative assessments, no specific comments that might have indicated a genuine desire
902 to provide feedback, and demographic responses that were illogical and designed to
903 obfuscate the survey.