

## ARTICLE

# Optimal allocation of resources among general and species-specific tools for plant pest biosecurity surveillance

Hoa-Thi-Minh Nguyen<sup>1</sup>  | Long Chu<sup>1</sup>  | Andrew M. Liebhold<sup>2,3</sup>  |  
Rebecca Epanchin-Niell<sup>4</sup>  | John M. Kean<sup>5</sup>  | Tom Kompas<sup>6</sup>  |  
Andrew P. Robinson<sup>7</sup>  | Eckehard G. Brockerhoff<sup>8</sup>  | Joslin L. Moore<sup>9,10</sup> 

<sup>1</sup>Crawford School of Public Policy, Australian National University, Canberra, Australian Capital Territory, Australia

<sup>2</sup>USDA Forest Service Northern Research Station, Morgantown, West Virginia, USA

<sup>3</sup>Czech University of Life Sciences, Faculty of Forestry and Wood Sciences, Prague, Czech Republic

<sup>4</sup>Department of Agricultural and Resource Economics, University of Maryland, College Park, Maryland, USA

<sup>5</sup>AgResearch Limited, Ruakura Science Centre, Hamilton, New Zealand

<sup>6</sup>Centre of Excellence for Biosecurity Risk Analysis, School of Biosciences and School of Ecosystem and Forest Sciences, University of Melbourne, Melbourne, Victoria, Australia

<sup>7</sup>Centre of Excellence for Biosecurity Risk Analysis, Schools of Biosciences and Mathematics and Statistics, University of Melbourne, Melbourne, Victoria, Australia

<sup>8</sup>Swiss Federal Institute for Forest, Snow and Landscape Research (WSL), Birmensdorf, Switzerland

<sup>9</sup>Arthur Rylah Institute for Environmental Research, Department of Energy, Environment and Climate Action, Heidelberg, Victoria, Australia

<sup>10</sup>School of Biological Sciences, Monash University, Clayton, Victoria, Australia

## Correspondence

Hoa-Thi-Minh Nguyen

Email: [hoa.nguyen@anu.edu.au](mailto:hoa.nguyen@anu.edu.au)

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## Abstract

This paper proposes a surveillance model for plant pests that can optimally allocate resources among survey tools with varying properties. While some survey tools are highly specific for the detection of a single pest species, others are more generalized. There is considerable variation in the cost and sensitivity of these tools, but there are no guidelines or frameworks for identifying which tools are most cost-effective when used in surveillance programs that target the detection of newly invaded populations. To address this gap, we applied our model to design a trapping surveillance program in New Zealand for bark- and wood-boring insects, some of the most serious forest pests worldwide. Our findings show that exclusively utilizing generalized traps (GTs) proves to be highly cost-effective across a wide range of scenarios, particularly when they are capable of capturing all pest species. Implementing surveillance programs that only employ specialized traps (ST) is cost-effective only when these traps can detect highly damaging pests. However, even in such cases, they significantly lag in cost-effectiveness compared to GT-only programs due to their restricted coverage. When both GTs and STs are used in an integrated

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surveillance program, the total expected cost (TEC) generally diminishes when compared to programs relying on a single type of trap. However, this relative reduction in TEC is only marginally larger than that achieved with GT-only programs, as long as highly damaging species can be detected by GTs. The proportion of STs among the optimal required traps fluctuates based on several factors, including the relative pricing of GTs and STs, pest arrival rates, potential damage, and, more prominently, the coverage capacity of GTs. Our analysis suggests that deploying GTs extensively across landscapes appears to be more cost-effective in areas with either very high or very low levels of relative risk density, potential damage, and arrival rate. Finally, STs are less likely to be required when the pests that are detected by those tools have a higher likelihood of successful eradication because delaying detection becomes less costly for these species.

#### KEYWORDS

bark- and wood-boring insects, general traps, optimal surveillance, plant pest, specialized traps, survey tools

## INTRODUCTION

As part of national biosecurity programs, many countries allocate considerable resources to preborder and border measures to prevent the accidental introduction of potentially damaging nonnative species (Hulme, 2011). Preborder biosecurity encompasses preventive measures targeting populations before they reach the border. These measures include prohibitions on the importation of specific plants or commodities, certifications verifying that imported materials are free of prohibited organisms, and phytosanitary treatments (Nahrung et al., 2023). On the other hand, border biosecurity entails inspection, detection tools, phytosanitary measures, and diagnostics to identify invasive species (Nahrung et al., 2023). However, certain invasion pathways are challenging to control. As a result, even with comprehensive border biosecurity measures, some new species may still arrive and establish.

In this context, effective surveillance, paired with eradication, becomes pivotal in national biosecurity programs. These actions are integral to postborder biosecurity, which also includes containment and pest management (Nahrung et al., 2023). The coupling of surveillance with eradication is also termed “early detection, rapid response” (Reaser et al., 2020). The classic strategy applied in these programs is to survey broad areas to detect and delimit new nascent populations in order to locate them for extirpation (Liebhold et al., 2016; van Havre & Whittle, 2015; Westbrooks, 2004). Conducting large-scale surveillance programs can be cumbersome and expensive. Thus, careful planning of such efforts can significantly influence their cost-effectiveness (Epanchin-Niell, 2017; Kean et al., 2015).

Many studies have been conducted to search for biosecurity surveillance design strategies that achieve improved economic efficiency. Some studies have focused on the development of specific tools such as remote sensing (Rocchini et al., 2015), molecular detection (Simmons et al., 2016), and semiochemical traps (Poland & Rassati, 2019) that provide increased sensitivity for the detection of individual species across large landscapes. Other studies have recognized an inherent trade-off in the allocation of resources between spending on survey and eradication versus methods devised for allocation between these actions (Bogich et al., 2008; Horie et al., 2013). Several studies have focused on the spatial allocation of surveillance intensity across landscapes to optimize invasive species detection and eradication (Epanchin-Niell et al., 2012; Hauser & McCarthy, 2009; Hester & Cacho, 2012; Kompas et al., 2016; Nguyen et al., 2021).

Another fundamental challenge in devising efficient surveillance/eradication strategies lies in the integration of surveillance programs among multiple species. In many cases, separate surveillance programs exist for individual target species within the same region, but combining these efforts into a single coordinated program could result in greater efficiency (Epanchin-Niell et al., 2014; Jarrad et al., 2011). This integration is challenging in part because different invading species may vary in their habitat requirements, invasion pathways, and impacts. Moreover, the detectability of different species can vary across survey methods. For example, various types of traps are typically used in surveillance programs that target insect pest species. Some types of traps are baited with lures

that can survey multiple species (Brockerhoff et al., 2006; Kerr et al., 2017; Rabaglia et al., 2019). Compounds such as  $\alpha$ -pinene and ethanol are attractive to a variety of bark- and wood-boring insects and can be used to simultaneously survey for a large number of species (Miller & Rabaglia, 2009; Sweeney et al., 2007). However, some of these same species may also be attracted to highly species-specific pheromones and can be used in traps to only detect individual species (Meier et al., 2016; Miller & Borden, 2000). Designing a unified surveillance program for detecting multiple invasive species poses challenges in resource allocation between highly specialized versus generalized survey methods.

Across countries, the implementation of surveillance programs varies significantly. European Union member countries, for instance, primarily use specialized survey tools, as they are mandated to survey a number of regulated pests. Generic traps are typically employed when no species-specific traps exist for a target (e.g., an unidentified pheromone) or for optional generic surveillance. This requirement likely arises from the presumption of predictability regarding which species will establish or be especially damaging. However, predicting such occurrences is challenging, and most species invasions are unexpected. Likely because of this, other countries prefer using more generic traps. Examples include the EDRR program in the United States (Rabaglia et al., 2019) and trap networks in New Zealand (Brockerhoff et al., 2006) and Italy (Rassati et al., 2015). Yet, tools that assist policymakers in determining whether to adopt species-specific traps, generic traps, or a blended approach to surveillance are scarcely existent.

In this light, we propose a model for optimizing the allocation of resources among species-specific and generalized survey tools for the surveillance and eradication of invading species. We ask whether species-specific survey tools are required given the prevalent use of the generalized ones (e.g., Brockerhoff et al., 2006; Rabaglia et al., 2019) and, if required, what the optimal combination would be. The model presented here optimizes total net benefits, accounting for both surveillance costs and discounted impacts anticipated following species establishment. We demonstrate the applicability of this optimization approach for the surveillance of bark- and wood-boring insects, which is typically accomplished using networks of attractant-baited traps (Brockerhoff et al., 2006; Rassati et al., 2015). In some programs, these traps are baited with host compounds (e.g., ethanol and  $\alpha$ -pinene) that are attractive to a range of bark- or wood-boring insect species (Rabaglia et al., 2019). Alternatively, higher-sensitivity species-specific lures are available for some species, and these are used for species-specific surveillance programs. We apply our optimization model to the previously developed analysis by Epanchin-Niell et al. (2014)

for the optimal allocation of resources for surveillance (i.e., postborder survey) for the presence of populations of bark- and wood-boring insects in New Zealand. Specifically, the insects are Scolytinae (bark and ambrosia beetles), Cerambycidae (longhorn beetles), and Siricidae (woodwasps). Our work differs from existing literature in that it provides an optimization framework that simultaneously optimizes the allocation of different survey tools (i.e., types of trap in this case) used for the surveillance of multiple target species.

## THE MODEL

Our model considers two trade-offs in surveillance against pests simultaneously. The first one is the choice between early and late detection. Here, a decision needs to be made as to how much to spend on detecting pests early so that eradication can be implemented to prevent further loss or damage. The second trade-off is the choice between different kinds of surveillance devices (i.e., traps). Some devices can detect one or a small number of pests with high sensitivity, while others attract a broader range of species, but at the expense of sensitivity.

We formalize our model in a way that facilitates the use of expert opinions. The reason is that estimating biological and economic parameters from data, especially those involved with uncertainty, is a challenging and ongoing task. Thus, we chose functional forms that minimize the required parameters without compromising the model's rigor and practical purpose when possible. Mathematics is expressed in the formula that is best suited with an intuitive explanation of parameters and the accompanying technical assumptions.

We first explain the notation and define the time horizon. We then delineate the modeling components for a single pest. Finally, we extend this framework to multipest-multitrap settings and describe some decision-making problems that this framework can address.

## NOTATION AND TIME HORIZON

In the model description, we use uppercase letters for numerical parameters and lowercase letters for functions, subscripts, and superscripts. We use superscripts to distinguish categories of variables, such as types of costs or probabilities. On the other hand, we use subscripts to index variables in different sets, such as a set of time, a set of pests, or a set of traps. The mathematics is specified in such a way that all numerical parameters have nonnegative values unless indicated otherwise.

Time in the model is discrete (i.e.,  $t = 0, 1, 2, \dots$ ). Traps are established at time  $t = 0$ , and the project spans over  $T$  years, from  $t = 1$  to  $t = T$ .

## SINGLE-PEST SETTING

### Dynamics of pest population

We largely follow Epanchin-Niell et al. (2014) in modeling the dynamics of pest species invasion. In particular, we denote by  $x(s, t)$  the number of isolated populations that are  $s$  years old at time  $t$ , that is, the populations established at time  $t - s$  that have remained undetected since then. We further denote by  $p^{\text{det}}(s, D)$  the detection probability given trap density  $D$ , which could be a vector if there is more than one type of trap, and the age of the population  $s$ . The dynamics of undetected populations can be formalized as follows:

$$x(1, t+1) = b(t) \text{ with } t = 0, 1, \dots, T-1, \quad (1)$$

$$x(s, t+1) = x(s-1, t) [1 - p^{\text{det}}(s-1, D)] \text{ with } s = 2, \dots, S^{\text{max}} \text{ and } t = 0, 1, \dots, T-1, \quad (2)$$

where  $b(t)$  is the arrival rate at time  $t$ , and  $S^{\text{max}}$  is the maximum age of a population. To this end, the number, location, and spatial extent of pest populations at any point in time are unknown prior to detection.

Likewise, the dynamics of detected population  $z(s, t)$  can be formalized in the form

$$z(1, t+1) = 0 \text{ with } t = 0, 1, \dots, T-1, \quad (3)$$

$$z(s, t+1) = [z(s-1, t) + x(s-1, t) \times p^{\text{det}}(s-1, D)] \times [1 - \text{erad}(s-1)p^{\text{er}}(s-1)] \text{ with } s = 2, \dots, T \text{ and } t = 0, 1, \dots, T-1, \quad (4)$$

where  $\text{erad}(s)$  is a dummy variable that takes a value of 1 when it is optimal to eradicate a population of age  $s$  and a value of zero otherwise;  $p^{\text{er}}(s)$  is the probability that an eradication campaign will be successful if it is chosen to occur.

### Pest spread

Following Epanchin-Niell et al. (2014), we assume that a pest population occupies an increasingly large circular area over time, and its spread follows a sigmoid function that allows for an initially accelerating rate of radial population range growth that eventually asymptotes at a rate  $g$ .

Under this assumption, the annual change in the radius of a population is given by  $gs^m/(h^m + s^m)$ , where  $s$  is the size class (or, equivalently, the age) of the population,  $g$  is the asymptotic radial rate of population growth,  $m$  is a shape parameter, and  $h$  is the time at which half the asymptotic rate of growth is achieved. We employ a shape parameter  $m = 5$  and half-time value  $h = 10$ , following Epanchin-Niell et al. (2014).

### Eradication cost

We denote by  $c^e(s)$  the cost of eradicating a population of age  $s$ . A function that presents  $c^e(s)$  needs to have two mathematical properties, (1)  $c^e(s) \geq 0$  and (2)  $\frac{\partial c^e(s)}{\partial s} > 0$ . These properties ensure that the eradication cost will be nonnegative and will rise as a population area increases. Many mathematical equations have these two properties, including

$$c^e(s) = C^{e0} \times a(s)^{C^e}, \quad (5)$$

where  $C^{e0}$  is a positive constant,  $a(s)$  is the size of the population at age  $s$ ,  $C^e$  is the elasticity of the eradication cost with respect to the population area, or if the population area increases by 1%, the eradication cost will increase by  $C^e$  percent.

### Probability of eradication success

Should eradication be chosen, the probability of success would either decrease or stay the same with the size of a population,  $a(s)$ , and, thus, the age  $s$ . In light of this assumption, the probability of successful eradication  $p^{\text{er}}(s)$  needs to satisfy the two properties including (1)  $p^{\text{er}}(s) \in [0, 1]$  and (2)  $\frac{\partial p^{\text{er}}(s)}{\partial s} \leq 0$ .

We choose a commonly used logit model that uses the cumulative density function of the logistic distribution

$$p^{\text{er}}(s) = \frac{e^w}{(1 + e^w)}, \text{ where } w = \beta_0 + \beta_1 \ln(a(s)), \quad (6)$$

of which  $\beta_1$  should be negative to satisfy the two preceding assumptions.

### Pest population damage

We assume that there is no damage if there is no population. On the other hand, the damage increases with population size. Bearing this in mind, a function representing the annual damage  $c^d(s)$  needs to satisfy the two

properties  $c^d(0) = 0$  and  $\frac{\partial c^d(s)}{\partial s} > 0$ . The most intuitive and simplest function satisfying these properties is probably in the form

$$c^d(s) = C^d \times a(s), \quad (7)$$

where  $C^d$  is the damage per hectare caused by the pest population.

Following Epanchin-Niell et al. (2014), the population damage will accumulate until it is successfully eradicated or it reaches its maximum age of an infestation, beyond which the damage stays constant. Thus,  $c^{\text{noer}}$ , the cumulative damage of a population of age  $s$  if it remains noneradicated, can be calculated as the present value of all future damage as follows:

$$c^{\text{noer}}(s) = \sum_{t=1}^{S^{\text{max}}-s} \frac{c^d(s+t)}{(1+\Gamma)^t}, \quad (8)$$

where  $\Gamma$  is an interest rate.

## When to eradicate?

A decision to eradicate a detected population needs to consider a trade-off. Eradication, if successful, will prevent cumulative damage,  $c^{\text{noer}}(s)$ . However, it will incur an up-front cost,  $c^e(s)$ , and the probability of successful eradication,  $p^{\text{er}}(s)$ , may be less than one. Thus, eradication should be chosen when the expected avoided cumulative damage is greater than the cost, in the form

$$\text{erad}(s) = 1. [c^e(s) < p^{\text{er}}(s) \times c^{\text{noer}}(s)], \quad (9)$$

where the Boolean function  $1.()$  returns a value of 1 if the eradication cost is less than the avoided damage, and zero otherwise.

## MULTIPEST–MULTITRAP DESIGN AND DETECTION PROBABILITY

### Design of trapping programs for multiple pests

Suppose there are  $M$  types of trapping devices (indexed as  $m = 1 \dots M$ ) and  $N$  pests (indexed as  $n = 1 \dots N$ ). We denote by  $S_{mn}$  the sensitivity of type- $m$  trap to type- $n$  pest or the probability that trap  $m$  will detect a population of pest  $n$  when the pest is located in its neighborhood. Trap  $m$  is considered a generalized trap (GT) if  $S_{mn} > 0$  for all

or most  $n \in \{1 \dots N\}$ . On the other hand, it is considered species-specific if  $S_{mn} > 0$  with only one or a few  $n \in \{1 \dots N\}$ .

We denote by  $A$  the area of the pest surveillance region and by  $D_m$  the density of trap  $m$ . Assuming a spatially random distribution of pest population establishments, the detection probability in Equation (2) can be extended to reflect the multipest–multitrap setting as follows:

$$p_n^{\text{det}}(s, D) = 1 - \prod_{m=1}^M \left[ \left( 1 - S_{mn} \min\left(\frac{a_n(s)}{A}, 1\right) \right)^{D_m A} \right], \quad (10)$$

where a subscript  $n$  is added to refer to the pest type.

### Cost of trapping programs

The cost of a trapping program is twofold. The first cost is the cost of establishing a trapping program:

$$C^{\text{start}}(D) = C^{\text{start-prog-oh}} + \sum_{m=1}^M [C_m^{\text{start-trap-oh}} \times 1.(D_m > 0) + C_m^{\text{start-trap}} D_m A], \quad (11)$$

where  $C^{\text{start-prog-oh}}$  is the overhead cost of the whole program, which does not depend on how many types of trap will be used (e.g., the cost of a program management unit does not normally vary with the trap quantity);  $C_m^{\text{start-trap-oh}}$  is the overhead cost of a type- $m$  trap subprogram, if any, which is incurred only if decision makers choose to use the type- $m$  trap (i.e., when  $D_m > 0$ ); and  $C_m^{\text{start-trap}}$  is the marginal cost of using each type- $m$  trap, which will vary with the type- $m$  trap quantity.

The second cost is the ongoing monitoring and maintenance cost of a trap:

$$C^{\text{og}}(D, t) = C^{\text{og-prog-oh}}(t) + \sum_{m=1}^M [C_m^{\text{og-trap-oh}}(t) \times 1.(D_m > 0) + C_m^{\text{og-trap}}(t) D_m A], \quad (12)$$

where  $C^{\text{og-prog-oh}}(t)$  is the annual overhead cost of the whole trapping program,  $C_m^{\text{og-trap-oh}}(t)$  is the annual overhead cost of the type- $m$  trap subprogram if any, and  $C_m^{\text{og-trap}}$  is the marginal cost of monitoring and maintaining each trap.

## Total expected cost

The total expected cost  $TEC(D)$ , which depends on the trapping density, has four components:

$$\begin{aligned}
 TEC(D) = & \underbrace{C^{\text{start}}(D)}_{\text{start-up cost}} + \underbrace{\sum_{t=1}^T \frac{C^{\text{og}}(D, t)}{(1+\Gamma)^t}}_{\text{on-going cost}} \\
 & + \underbrace{\sum_{t=1}^T \sum_{n=1}^N \sum_{s=1}^{S_{\max}} \frac{[x_n(s, t) + z_n(s, t)]c_n^d(s)}{(1+\Gamma)^t}}_{\text{cumulative damage}} \\
 & + \underbrace{\sum_{t=1}^T \sum_{n=1}^N \sum_{s=1}^{S_{\max}} \frac{x_n(s, t)p_n^{\text{det}}(s, D)\text{erad}_n(s)c_n^e(s)}{(1+\Gamma)^t}}_{\text{cumulative eradication cost}} \\
 & + \underbrace{\sum_{n=1}^N \sum_{s=1}^{S_{\max}} \frac{c_n^{\text{noer}}(s)[x_n(s, T+1) + z_n(s, T+1)]}{(1+\Gamma)^{T+1}}}_{\text{residual cost}}, \quad (13)
 \end{aligned}$$

where the first two terms represent, respectively, the startup and ongoing costs of the surveillance program; the third and fourth terms capture, respectively, the damage and eradication cost, while the final term, “residual” cost, covers all damage after the program ends (i.e., at time  $T$ ) for a particular period. It is worth noting that all costs are in present value and summed up over time, pest, and population ages.

## The decision-making problem

The decision-making problem is to choose the density of all trap types, that is,  $D \equiv [D_1, D_2, \dots, D_m]$ , so that the total expected cost of a surveillance program is minimized:

$$\min_{D \geq 0} TEC(D). \quad (14)$$

We solved this problem using a nonlinear programming solver (i.e., `fmincon`) in MATLAB version R2020a.

## EMPIRICAL APPLICATION: MODEL PARAMETERIZATION

We apply our model to design an optimal network of traps to detect invasions of bark- and wood-boring insect species in New Zealand. These insects complete their larval development in the bark, phloem, or xylem of living or recently dead woody plants

(Dodds et al., 2023; Lieutier et al., 2004). Prominent taxa include Scolytinae, Cerambycidae, Buprestidae, Siricidae, and others. Our model parameters can be classified under four categories: general, pest-related, trapping cost, and trap sensitivity parameters. All values discussed in this application are in 2011 US dollars, unless otherwise specified.

## General parameters

The baseline values of the general parameters and their ranges for sensitivity analysis are presented in Appendix S1: Table S1. We consider a 30-year time horizon for the surveillance program and an annual interest rate of 5%.

The surveillance program covers four New Zealand port regions: Auckland, Tauranga, Wellington, and Christchurch. Together, these regions receive approximately 90% of the trade volume that poses the greatest risk for invasions of bark- or wood-boring insects (Epanchin-Niell et al., 2014). The trapping program discussed in this paper predominantly targets 20% of the urban areas in these regions, which we estimate would detect about 80% of future invaders. This assumption is made based on the widespread understanding that high-risk sites are typically clustered around ports, including industrial and commercial zones where imports are unloaded. Hence, we anticipate these regions to experience a higher concentration of new invasions in the future. The percentage pertaining to areas and invaders considered here is anchored in the findings of Epanchin-Niell et al. (2014). We direct readers to their work for a comprehensive sensitivity analysis of this assumption. In our paper, we accept this assumption as a base premise and focus our investigation on determining the optimal allocation of various trap types within a trapping program.

## Pest-related parameters

Appendix S2 presents the pest-related parameter values, with a summary provided in Section S1, Table S1. In the baseline, the arrival rate is 0.065 introductions per year, which is based on historical data from 1980 to 2011 for New Zealand (Epanchin-Niell et al., 2014). Considering the potential substantial uncertainty surrounding this rate (Haack et al., 2014, 2022), the subsection *Empirical application: Model results* examines how variations in this rate might impact our results. Following the approach used by Epanchin-Niell et al. (2014), we allocated this rate proportionally to the flow of trade that is likely to use wood packing material—the most probable

introduction pathway of wood-boring beetles—across four surveillance sites. Thus, Auckland, Christchurch, Tauranga, and Wellington account for 48.7%, 9.3%, 23.0%, and 8.1% of the introduction risk, respectively. With areas of 217, 90, 33.6, and 88.8 km<sup>2</sup>, the corresponding shares of risk per square kilometer are 0.23%, 0.10%, 0.68%, and 0.09%. Consequently, Tauranga, the smallest region, is also the riskiest in terms of relative risk density. The relative risk density here is about three times that of Auckland and seven times greater than that of the other two regions.

We consider nine potential species classes, classified based on two features: damage and trap responsiveness, with each feature having three subclasses (Appendix S2: Section S1, Table S2). We choose to delineate invasive species based on their classes rather than as specific species because it is difficult to know which bark- or wood-boring insect species are most likely to establish in the future. We assume that the features of damage and trap responsiveness are pair-wise independent. That is, the proportion in each species class is the product of its proportions of each damage and trap responsiveness subclass.

The damage caused by a species can be low, medium, or high. We assume the baseline corresponding species distribution based on these damage levels is 70%, 20%, and 10%, respectively. Our assumption is based on evidence from Aukema et al. (2011) for wood borers, which suggests that the smallest fraction of new species causes the most extensive damage, while most species cause low damage, and a smaller proportion causes medium damage.

The harvest value is estimated to be USD 103.12/ha/year. This estimation is based on New Zealand's annual forest land harvest value of USD 1154 million (Epanchin-Niell et al., 2014), and its total forest land area is 11.19 million ha (Landcare Research New Zealand Ltd, 2020). Following Epanchin-Niell et al. (2014), we assume a 5-year delay before damage begins accruing in a newly invaded forest to account for initially low population densities. Following this delay, damage increases linearly in those areas over the next 5 years to reach their maximum reduction in harvest value in the 10th year following the arrival of the invader. Maximum reductions in harvest value continue until the maximum age of the population,  $S^{\max}$ , or until the population is eradicated. We assume low-, medium-, and high-damage pests cause 1%, 10%, and 50% of the total possible damage, respectively.

Likewise, there are three subclasses in trap responsiveness. A species can be trapped by (1) GTs, but not specialized traps (STs) (labeled as GT species), (2) GTs and STs (ST species), or (3) not detected by any trap types (NT species). This classification is motivated by the fact

that most species respond to GTs, while species that could be detected using specialist lures (STs) could also be targeted by generalist lures. In the sensitivity analysis presented in the subsection *Empirical application: Model results*, we explore scenarios where ST species are exclusively trapped by STs and the rarer scenario where there are NT species in a population.

For the baseline, we assume that only 5% of species are ST species, all of which are highly damaging. This assumption takes into account the fact that species-specific tools are only available for certain target species, and these tend to be developed for species posing the most significant risk of severe damage. It is worth noting that we later explore another scenario in the subsection *Empirical application: Model results*, where this 5% of ST species are evenly distributed across all damage levels.

In practice, multiple types of specific traps may be used concurrently and are capable of attracting one or several species. As long as they share the same attributes—namely, their trapping coverage, cost, and sensitivity—they are considered to be the same type from the model's perspective. Due to a lack of comprehensive data on the sensitivity and cross-sensitivity ranges of various potential STs, we have restricted our focus to one specific trap type in our application, despite our model's capacity to consider multiple trap types. We categorize all species that respond exclusively to that trap type as ST species. Although we acknowledge that the context of our application is not perfect, we firmly believe that the insights derived remain invaluable.

In every scenario, we assume that all low- and medium-damage species spread at a rate of 20 km/year, while high-damage species spread at a rate of 30 km/year. This assumption is based on the study by Epanchin-Niell et al. (2014), where it was determined that slower invading species spread at a rate of 10 km/year, while faster ones can disperse up to 50 km/year. Following Epanchin-Niell et al. (2014), we also assume that the maximum age of an infestation, denoted by  $S_{\max}$ , is 75 years. We direct readers to Epanchin-Niell et al. (2014) for a sensitivity analysis of these parameters. The maximum size of an infestation is determined by the total area that provides suitable habitat for wood-boring beetles, based on the land cover database for New Zealand (Appendix S2: Section S1, Table S4).

Finally, both the eradication cost and the maximum probability of successful eradication are functions of population range areas. Their function coefficients are estimated based on empirical evidence from Brockerhoff et al. (2010) and Epanchin-Niell et al. (2014) (see our Appendix S2B,C for more details). We assume that the coefficients are the same for all species classes.

## Trapping cost parameters

In the baseline, we assume the costs of GTs and STs are the same. These costs include all expenses detailed in Equations (11) and (12). The annual fixed cost of the whole trapping program is USD 25,000 as in Epanchin-Niell et al. (2014). The cost of adding a trap of both types depends on the trap density, ranging from USD 328 to USD 633 (Appendix S3). For the purpose of sensitivity analysis, we accommodate a 50% increase in the cost associated with setting up each type of trap relative to the baseline. The implications of these cost adjustments on the TEC of a trapping program are discussed in the subsection *Empirical application: Model results*.

## Trap sensitivity (or insect-capture) parameters

GTs and STs vary not only by the range of species they can trap and their associated cost but also by their efficiency at trapping or trap sensitivity. Under our baseline assumptions, we assign trap sensitivities of 80% to STs and 15% to GTs. We evaluate the influence of these assumptions on TEC of a trapping program by exploring two additional scenarios: one where the ST sensitivity increases to 90%, and another where the GT sensitivity decreases to 10%. These scenarios are discussed in the subsection *Empirical application: Model results*. In the interest of thoroughness and covering a broad range of potential parameter values, we provide in Appendix S4: Figure S1 additional results illustrating how the TEC and the proportion of STs required in integrated programs are impacted when the sensitivity of STs is varied from 30% to 90%.

It is important to acknowledge the complexity involved in determining the parameter values of trap sensitivity. In the absence of more concrete data, we rely on a Poisson model of insect capture proposed by Turchin and Odendaal (1996) for the southern pine beetle. Their research established that a multifunnel trap baited with frontalinal and turpentine for southern pine beetle has an effective sampling area (ESA) of ~0.1 ha. The ESA is defined as the area by which the trap catch must be divided to estimate the population density (Turchin & Odendaal, 1996). To quantify the trap sensitivity, we used the formula “ $1 - \exp(-\min(\text{ESA}, \text{occupied area}) \times \text{mean population density within the occupied area})$ ” as suggested by Kean (2015) and adopted by Epanchin-Niell et al. (2014). Notably, Epanchin-Niell et al. (2014) applied this formula and the ESA of ~0.1 ha to justify a trap sensitivity of 60%, implying an initial population density of about 9.2 beetles/ha. The sensitivity range of 30%–90%

corresponds to 3.3–21.5 trappable beetles/hectare for this combination of target species and trap type.

## Empirical application: Model results

This section presents evidence of when an integrated trapping surveillance program is required and optimal combinations of GTs and STs. Our discussion centers around the impact of establishing a trapping program compared with the case of “do nothing” and the effect of possibly using a single trap type versus a combination of them. The section starts with a discussion of the baseline results, followed by an analysis of the changes when key model parameters vary.

### Baseline

Recall that under a “do nothing” strategy, TEC simply equals the total expected damage in the absence of pest eradication. On the other hand, the TEC under a trapping strategy has various components (Equation 13). Here, we only present TECs and their most significant expected cost components for brevity, namely, damage and trapping costs. The eradication cost is negligible in our model since eradication happens only when its benefit exceeds its cost (Equation 9). Results for the baseline scenarios are in italics (Table 1).

From the table we observe that setting up a trapping program is economically efficient in all four sites. Single-trap-type surveillance programs using only STs cost 63%–68% of the TEC in the case of “do nothing,” while programs using only GTs are even more economically efficient, costing only 11%–26% of the baseline’s TECs. The use of integrated survey tools only marginally reduces TECs compared with GT-only programs. Although including STs in GT-only programs always reduces TECs, it can either increase or decrease the total number of traps at optimal. Trapping costs under these programs range from 33% to 47% of the TEC.

Moreover, Table 1 reveals significant differences in trap density among the four sites. For programs that use only GTs, Tauranga requires about 700 traps/km<sup>2</sup>, while Auckland requires only 317 traps/km<sup>2</sup>, and Wellington and Christchurch require just 100 traps/km<sup>2</sup>. Similar heterogeneity in trap density is observed for programs that use only STs and those that include both STs and GTs. These results suggest that the regions’ relative risk densities are positively related to their optimal trap densities. Here, we use the term “risk” synonymously with the annual rate or likelihood of pest introduction.

**TABLE 1** Baseline and impact of changes in annual arrival rate ( $b$ ) of invasive species.

| Arrival rate                                         | Trapping programming | Total expected cost (USD million) | Damage (USD millionAU) | Trap cost (USD million) | Traps required (traps) | Trap density (traps/km <sup>2</sup> ) |
|------------------------------------------------------|----------------------|-----------------------------------|------------------------|-------------------------|------------------------|---------------------------------------|
| (a) Auckland (share of risk/km <sup>2</sup> = 0.22%) |                      |                                   |                        |                         |                        |                                       |
| $b = 0.18$                                           |                      |                                   |                        |                         |                        |                                       |
|                                                      | Doing nothing        | 12,400                            | 12,400                 |                         |                        |                                       |
|                                                      | GT only              | 1482                              | 752                    | 729                     | 144,348                | 665                                   |
|                                                      | ST only              | 7775                              | 7592                   | 183                     | 36,133                 | 166                                   |
|                                                      | GT and ST            | 1448                              | 768                    | 680                     |                        |                                       |
|                                                      | GT                   |                                   |                        |                         | 121,156                | 558                                   |
|                                                      | ST                   |                                   |                        |                         | 13,417                 | 62                                    |
|                                                      | ST share             |                                   |                        |                         | 0.10                   |                                       |
| <i>Baseline (<math>b = 0.065</math>)</i>             |                      |                                   |                        |                         |                        |                                       |
|                                                      | <i>Doing nothing</i> | <i>4478</i>                       | <i>4478</i>            |                         |                        |                                       |
|                                                      | <i>GT only</i>       | <i>858</i>                        | <i>509</i>             | <i>348</i>              | <i>68,850</i>          | <i>317</i>                            |
|                                                      | <i>ST only</i>       | <i>2900</i>                       | <i>2782</i>            | <i>118</i>              | <i>23,336</i>          | <i>107</i>                            |
|                                                      | <i>GT and ST</i>     | <i>811</i>                        | <i>512</i>             | <i>300</i>              |                        |                                       |
|                                                      | <i>GT</i>            |                                   |                        |                         | <i>44,132</i>          | <i>203</i>                            |
|                                                      | <i>ST</i>            |                                   |                        |                         | <i>15,061</i>          | <i>69</i>                             |
|                                                      | <i>ST share</i>      |                                   |                        |                         | <i>0.25</i>            |                                       |
| $b = 0.0325$                                         |                      |                                   |                        |                         |                        |                                       |
|                                                      | Doing nothing        | 2239                              | 2239                   |                         |                        |                                       |
|                                                      | GT only              | 541                               | 392                    | 148                     | 29,227                 | 135                                   |
|                                                      | ST only              | 1497                              | 1423                   | 75                      | 14,660                 | 67                                    |
|                                                      | GT and ST            | 516                               | 343                    | 173                     |                        |                                       |
|                                                      | GT                   |                                   |                        |                         | 23,820                 | 110                                   |
|                                                      | ST                   |                                   |                        |                         | 10,194                 | 47                                    |
|                                                      | ST share             |                                   |                        |                         | 0.30                   |                                       |
| (b) Tauranga (share of risk/km <sup>2</sup> = 0.68%) |                      |                                   |                        |                         |                        |                                       |
| $b = 0.18$                                           |                      |                                   |                        |                         |                        |                                       |
|                                                      | Doing nothing        | 5856                              | 5856                   |                         |                        |                                       |
|                                                      | GT only              | 411                               | 227                    | 184                     | 36,273                 | 1080                                  |
|                                                      | ST only              | 3605                              | 3565                   | 40                      | 7786                   | 232                                   |
|                                                      | GT and ST            | 409                               | 230                    | 179                     |                        |                                       |
|                                                      | GT                   |                                   |                        |                         | 33,875                 | 1008                                  |
|                                                      | ST                   |                                   |                        |                         | 1436                   | 43                                    |
|                                                      | ST share             |                                   |                        |                         | 0.04                   |                                       |
| <i>Baseline (<math>b = 0.065</math>)</i>             |                      |                                   |                        |                         |                        |                                       |
|                                                      | <i>Doing nothing</i> | <i>2115</i>                       | <i>2115</i>            |                         |                        |                                       |
|                                                      | <i>GT only</i>       | <i>241</i>                        | <i>122</i>             | <i>119</i>              | <i>23,490</i>          | <i>699</i>                            |
|                                                      | <i>ST only</i>       | <i>1324</i>                       | <i>1294</i>            | <i>30</i>               | <i>5779</i>            | <i>172</i>                            |
|                                                      | <i>GT and ST</i>     | <i>237</i>                        | <i>125</i>             | <i>112</i>              |                        |                                       |
|                                                      | <i>GT</i>            |                                   |                        |                         | <i>19,981</i>          | <i>595</i>                            |
|                                                      | <i>ST</i>            |                                   |                        |                         | <i>2034</i>            | <i>61</i>                             |
|                                                      | <i>ST share</i>      |                                   |                        |                         | <i>0.09</i>            |                                       |

(Continues)

TABLE 1 (Continued)

| Arrival rate                                            | Trapping programming | Total expected cost (USD million) | Damage (USD millionAU) | Trap cost (USD million) | Traps required (traps) | Trap density (traps/km <sup>2</sup> ) |
|---------------------------------------------------------|----------------------|-----------------------------------|------------------------|-------------------------|------------------------|---------------------------------------|
| <i>b</i> = 0.0325                                       |                      |                                   |                        |                         |                        |                                       |
|                                                         | Doing nothing        | 1057                              | 1057                   |                         |                        |                                       |
|                                                         | GT only              | 169                               | 90                     | 78                      | 15,413                 | 459                                   |
|                                                         | ST only              | 675                               | 652                    | 23                      | 4430                   | 132                                   |
|                                                         | GT and ST            | 163                               | 92                     | 70                      |                        |                                       |
|                                                         | GT                   |                                   |                        |                         | 11,432                 | 340                                   |
|                                                         | ST                   |                                   |                        |                         | 2287                   | 68                                    |
|                                                         | ST share             |                                   |                        |                         | 0.17                   |                                       |
| (c) Christchurch (share of risk/km <sup>2</sup> = 0.1%) |                      |                                   |                        |                         |                        |                                       |
| <i>b</i> = 0.18                                         |                      |                                   |                        |                         |                        |                                       |
|                                                         | Doing nothing        | 2368                              | 2368                   |                         |                        |                                       |
|                                                         | GT only              | 409                               | 228                    | 182                     | 35,846                 | 398                                   |
|                                                         | ST only              | 1520                              | 1464                   | 56                      | 10,936                 | 122                                   |
|                                                         | GT and ST            | 391                               | 232                    | 159                     |                        |                                       |
|                                                         | GT                   |                                   |                        |                         | 25,019                 | 278                                   |
|                                                         | ST                   |                                   |                        |                         | 6245                   | 69                                    |
|                                                         | ST share             |                                   |                        |                         | 0.20                   |                                       |
| <i>Baseline</i> ( <i>b</i> = 0.065)                     |                      |                                   |                        |                         |                        |                                       |
|                                                         | <i>Doing nothing</i> | <i>855</i>                        | <i>855</i>             |                         |                        |                                       |
|                                                         | <i>GT only</i>       | <i>211</i>                        | <i>154</i>             | <i>57</i>               | <i>11,167</i>          | <i>124</i>                            |
|                                                         | <i>ST only</i>       | <i>575</i>                        | <i>545</i>             | <i>29</i>               | <i>5652</i>            | <i>63</i>                             |
|                                                         | <i>GT and ST</i>     | <i>203</i>                        | <i>135</i>             | <i>68</i>               |                        |                                       |
|                                                         | <i>GT</i>            |                                   |                        |                         | <i>9389</i>            | <i>104</i>                            |
|                                                         | <i>ST</i>            |                                   |                        |                         | <i>3892</i>            | <i>43</i>                             |
|                                                         | <i>ST share</i>      |                                   |                        |                         | <i>0.29</i>            |                                       |
| <i>b</i> = 0.0325                                       |                      |                                   |                        |                         |                        |                                       |
|                                                         | Doing nothing        | 428                               | 428                    |                         |                        |                                       |
|                                                         | GT only              | 127                               | 92                     | 36                      | 6943                   | 77                                    |
|                                                         | ST only              | 297                               | 285                    | 11                      | 2119                   | 24                                    |
|                                                         | GT and ST            | 127                               | 88                     | 39                      |                        |                                       |
|                                                         | GT                   |                                   |                        |                         | 6484                   | 72                                    |
|                                                         | ST                   |                                   |                        |                         | 1000                   | 11                                    |
|                                                         | ST share             |                                   |                        |                         | 0.13                   |                                       |
| (d) Wellington (share of risk/km <sup>2</sup> = 0.09%)  |                      |                                   |                        |                         |                        |                                       |
| <i>b</i> = 0.18                                         |                      |                                   |                        |                         |                        |                                       |
|                                                         | Doing nothing        | 2062                              | 2062                   |                         |                        |                                       |
|                                                         | GT only              | 376                               | 216                    | 160                     | 31,661                 | 357                                   |
|                                                         | ST only              | 1330                              | 1278                   | 52                      | 10,151                 | 114                                   |
|                                                         | GT and ST            | 358                               | 219                    | 138                     |                        |                                       |
|                                                         | GT                   |                                   |                        |                         | 21,072                 | 237                                   |
|                                                         | ST                   |                                   |                        |                         | 6200                   | 70                                    |
|                                                         | ST share             |                                   |                        |                         | 0.23                   |                                       |

**TABLE 1** (Continued)

| Arrival rate                             | Trapping programming | Total expected cost (USD million) | Damage (USD millionAU) | Trap cost (USD million) | Traps required (traps) | Trap density (traps/km <sup>2</sup> ) |
|------------------------------------------|----------------------|-----------------------------------|------------------------|-------------------------|------------------------|---------------------------------------|
| <i>Baseline (<math>b = 0.065</math>)</i> |                      |                                   |                        |                         |                        |                                       |
|                                          | <i>Doing nothing</i> | <i>745</i>                        | <i>745</i>             |                         |                        |                                       |
|                                          | <i>GT only</i>       | <i>190</i>                        | <i>140</i>             | <i>50</i>               | <i>9875</i>            | <i>111</i>                            |
|                                          | <i>ST only</i>       | <i>504</i>                        | <i>478</i>             | <i>26</i>               | <i>4939</i>            | <i>56</i>                             |
|                                          | <i>GT and ST</i>     | <i>184</i>                        | <i>123</i>             | <i>61</i>               |                        |                                       |
|                                          | <i>GT</i>            |                                   |                        |                         | <i>8616</i>            | <i>97</i>                             |
|                                          | <i>ST</i>            |                                   |                        |                         | <i>3324</i>            | <i>37</i>                             |
|                                          | <i>ST share</i>      |                                   |                        |                         | <i>0.28</i>            |                                       |
| <i><math>b = 0.0325</math></i>           |                      |                                   |                        |                         |                        |                                       |
|                                          | <i>Doing nothing</i> | <i>372</i>                        | <i>372</i>             |                         |                        |                                       |
|                                          | <i>GT only</i>       | <i>115</i>                        | <i>82</i>              | <i>33</i>               | <i>6423</i>            | <i>72</i>                             |
|                                          | <i>ST only</i>       | <i>260</i>                        | <i>251</i>             | <i>9</i>                | <i>1690</i>            | <i>19</i>                             |
|                                          | <i>GT and ST</i>     | <i>115</i>                        | <i>79</i>              | <i>36</i>               |                        |                                       |
|                                          | <i>GT</i>            |                                   |                        |                         | <i>5954</i>            | <i>67</i>                             |
|                                          | <i>ST</i>            |                                   |                        |                         | <i>1000</i>            | <i>11</i>                             |
|                                          | <i>ST share</i>      |                                   |                        |                         | <i>0.14</i>            |                                       |

Note: “GT only” denotes a trapping program that uses only generalized traps; “GT and ST” denotes a trapping program that potentially uses both generalized and specialized traps. The baseline results are in italics. All costs and damage are rounded to the nearest million USD.

Abbreviations: GT, generalized trap; ST, specialized trap.

Finally, we observe an inverse relationship between the risk density and the share of STs at optimal levels. For example, Tauranga has the lowest optimal share of STs with only 9%, followed by Auckland with 25%, while the other two regions optimally include 28%–29% of total traps as ST in their integrated survey programs. These results suggest that it is more economically efficient to blanket landscapes with GTs in high-risk areas due to GTs’ extensive coverage.

### Impact of changes in annual countrywide arrival rate of invasive species

We began by analyzing the impact of the upper and lower bounds of the annual countrywide arrival rate, 0.0325 and 0.18, respectively (Table 1).

Across regions, costs move in line with arrival rates. We also observed a positive correlation between the arrival rate and the optimal number of traps in single-trap-type programs, as well as between the arrival rate and the optimal number of GTs in integrated programs.

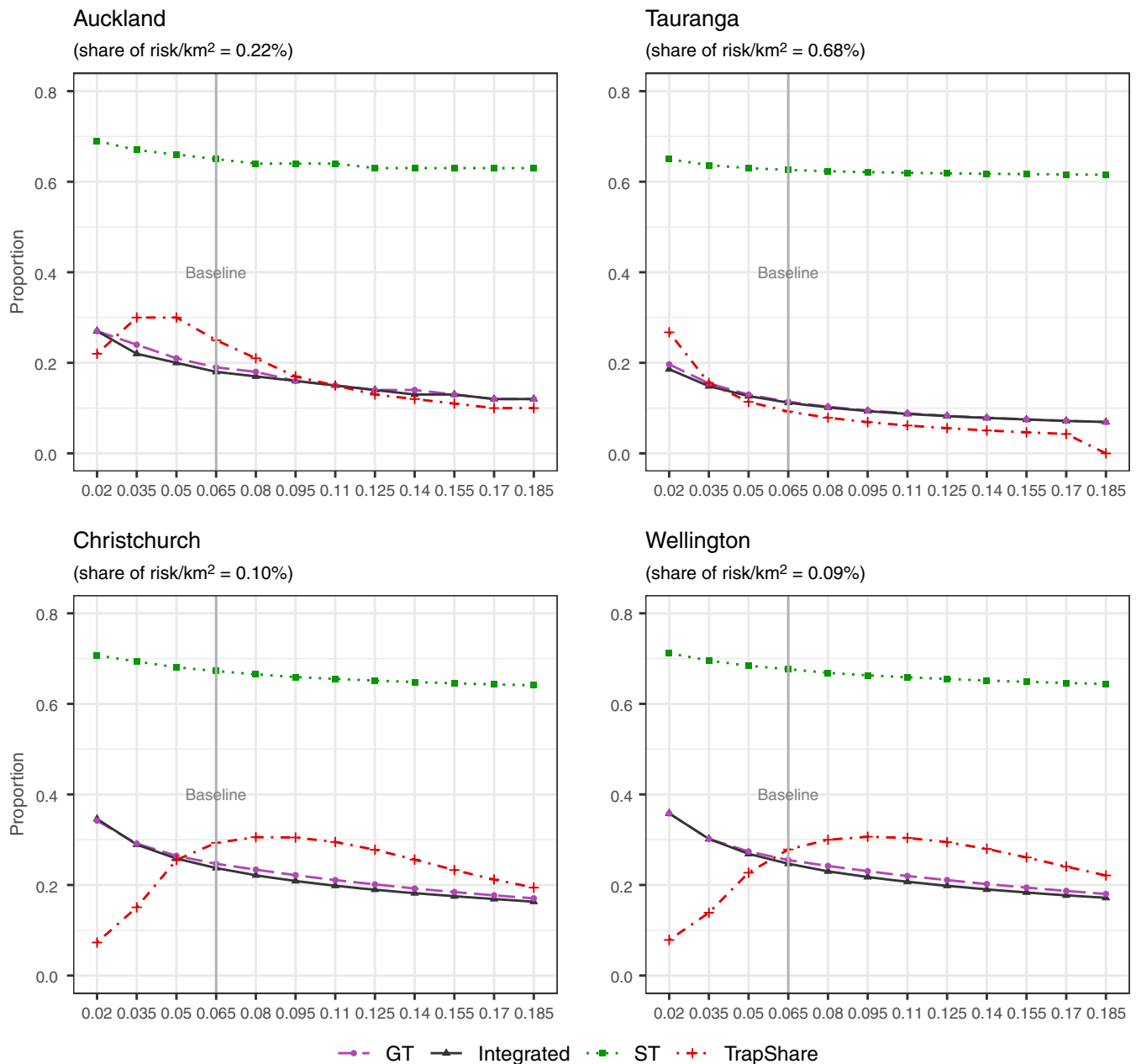
However, for STs in integrated programs, the results are more complex. We found no consistent relationship between the arrival rate and the numbers or shares of STs within regions. For example, in Auckland, the optimal number of STs decreased when the arrival rate either

increased or decreased. On the other hand, in Tauranga, the area with the highest risk, the optimal number of STs was negatively related to the arrival rate, while in the other two regions it was positively associated with the arrival rate.

To gain a better understanding of this relationship, we increased the level of granularity of our analysis. We focused on the relationship between the arrival rate and the share of STs in integrated programs, divided the range of arrival rates ([0.18–0.032]) into 12 small steps, and obtained the model outcome for each of them.

Figure 1 reveals three key findings. First, the share of STs is hump-shaped with respect to the arrival rate in Auckland, Christchurch, and Wellington. The share increases when the rate increases, reaches its peak, and then falls. The similarity in the lines for Christchurch and Wellington suggests that the relative risk density strongly influences this relationship. In Auckland, the share reaches its peak much faster than those of less risky regions, while there is no peak in Tauranga. These results confirm the baseline findings that it is not economically efficient to use STs in areas where the risk of pest entry is either too high or too low.

Second, trapping surveillance programs become more cost-effective as the arrival rate increases, particularly for integrated and GT-only programs. The proportions of TECs relative to those under the “do nothing” scenario decrease from 0.7 to 0.6 for ST-only programs and from



**FIGURE 1** Total expected costs (TEC) under different trapping programs relative to corresponding TEC under a “do nothing” scenario and the share of STs in the required traps of integrated programs as the arrival rate varies. GT, GT-only surveillance programs; ST, ST-only surveillance programs; integrated, GT- and ST-integrated programs; and TrapShare, share of STs in total required traps of an integrated trapping program. Each point in red dashed-dotted line represents the share of STs in the total required traps of an integrated trapping program for each value of arrival rate. Meanwhile, each point on the other three lines represents the corresponding shares of the TEC of a corresponding trapping program compared to that under “do nothing.” The vertical bar represents the baseline scenario. The min and max of the horizontal axis represents roughly the upper and lower bounds of the arrival rate.

0.3 to 0.1 for other programs as the arrival rate increases from the lower to upper bound.

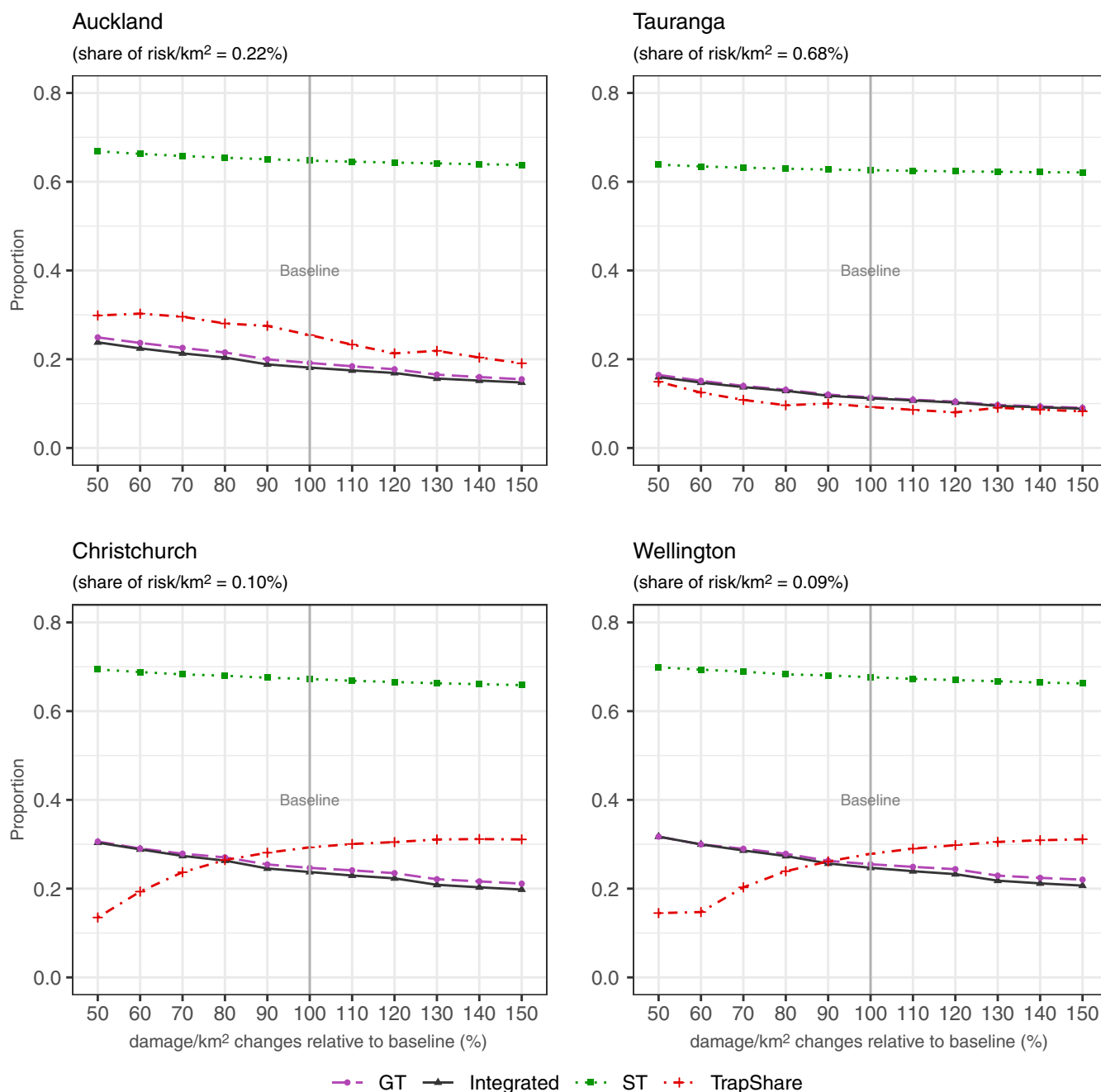
Lastly, the benefit of using STs diminishes as the arrival rate increases. This is seen in the widening gap between the loci of proportions for the ST-only program and those of the other two programs as the arrival rate increases. This finding underscores the need to use GTs in high-risk settings.

## Impact of changes in damage density

The financial cost of damage per hectare (i.e., damage density) has a significant impact on the need for a surveillance program. In the extreme case where damage density is zero, no surveillance program is necessary. To examine the impact of changes in damage

density, we analyzed a range of 0.5 to 1.5 times the baseline damage density and divided it into 11 small steps. We obtained model outcomes for each step to determine the impact on the TECs of surveillance programs.

Figure 2 shows two key insights. First, the cost savings of trapping programs relative to the “do nothing” scenario increase as damage density increases, particularly for integrated and GT-only programs. Second, there is a hump-shaped curvature in the share of STs in the



**FIGURE 2** Total expected costs (TEC) under different trapping programs relative to corresponding TEC under “do nothing” and ST shares in the required traps of integrated programs as the damage per square kilometer varies. GT, GT-only surveillance programs; ST, ST-only surveillance programs; integrated, GT- and ST-integrated programs; and TrapShare, share of STs in total required traps of an integrated trapping program. Each point in the red dashed-dotted line represents the share of STs in the total required traps of an integrated trapping program for each level of damage per square kilometer relative to baseline. Meanwhile, each point on the other three lines represents the corresponding shares of the TEC of a corresponding trapping program compared to that under “do nothing.” The vertical bar represents the baseline scenario. Moving to the left of the horizontal axis, the damage per square kilometer gradually reduces to the level of 50% of baseline, and moving to the right, the damage per square kilometer increases gradually to the level of 150% of baseline.

total required traps, as can be inferred from the positive relationship between the share of STs and damage density in areas at low risk, such as Christchurch and Wellington, and the corresponding inverse relationship in Tauranga and Auckland, which are regions at high risk. These results suggest the use of GTs when damage density is very low or very high.

## Impact of changes in trapping costs

In this subsection, we explore how the cost of STs and GTs affects the TEC of a trapping program. It is reasonable to assume that STs are more expensive than GTs due to factors such as the need for a special lure and lack of economies of scale as they can be used just for one or a tiny number of species (Rabaglia et al., 2019). However, the wide coverage of GTs also implies that the bycatch in those traps can be much higher than that in STs, resulting in higher labor costs for sorting out invasive species. To investigate this, we simulated scenarios where each type of trap's cost was increased by 50% compared to the baseline.

Table 2 presents the results of the simulations. We observed that TECs increased when trap costs increased, particularly for GTs. This increase was likely due to the fact that fewer traps were used at optimal, leading to greater damage. Additionally, as the cost of one trap type increased, demand for that type fell while demand for the other type increased, due to changes in their “relative” prices.

It is worth noting that the absolute change in TEC resulting from the shift in the trapping cost of GTs was much larger than that of STs due to their more extensive use. While STs are substitutable for only a small share of species, GTs can be fully interchangeable with STs. Therefore, their impact is more significant.

## Impact of changes in range of species that traps can capture

The range of species that each trap type can capture is anticipated to significantly influence model outcomes. To explore this impact, we evaluated three scenarios.

In the first scenario, we distributed the 5% of species that STs can capture across all damage levels, rather than isolating them to the highly damaging subgroup as in the baseline (Table 3). Across all sites, the TEC of ST-only programs rose considerably, a 50% increase compared to the baseline values. This significant increase was primarily caused by the rise in damage since fewer high-damage

pests could then be captured by STs. Consequently, the benefits of STs are outweighed by their costs, rendering their use no longer optimal in integrated programs.

In the second scenario, we assume that GTs cannot capture ST insects (Table 3). Predictably, the results of ST-only programs remained the same compared with those of the baseline as nothing changed over STs. However, there was a marked shift in GT-only programs. Specifically, the TEC in Tauranga, the riskiest region, more than quadrupled, while the TEC in Auckland, the second riskiest region, almost tripled. In the remaining regions, the TEC more than doubled. The bulk of this increase in TEC is attributed to the heightened damage caused by pests that GTs can no longer lure in this scenario. In integrated programs, there is a marginal increase in TEC, ranging from 4% to 7%, thanks to the optimization of the use of trap types. To this effect, we observed the proportion of STs used escalated significantly—nearly threefold in Tauranga and about 1.5-fold in other regions. This suggests that even minor changes in the species range captured by GTs can lead to substantial shifts in their demand within optimal integrated programs.

In our third scenario, we reduced GT coverage by 20%, meaning that 20% of the pest population, distributed across all damage levels, could not be trapped (i.e., the NT species). As expected, the results of single-trap-type programs that use only STs were the same as those in the baseline, since nothing changed in this scenario. However, the impact of programs that use GTs was significant. Specifically, TECs under those programs increased by 65%–165%, with the magnitude of the impact positively correlated with the region's relative risk density. These additional costs are mainly due to increased damage when it is impossible to trap some pests. In parallel, the number of required GTs and their densities were reduced across regions by 11%–34%, while the relative use of STs increased proportionally with regional relative risk densities (Table 4). Specifically, the share of STs almost doubled in Tauranga and increased by 50% in Auckland and 20% in the other regions. Thus, a reduction in GT coverage not only increased TECs but also reduced the number of GTs while increasing the number of STs required at optimal numbers due to the change in their relative effectiveness in catching pests.

## Impact of changes in probability of successfully eradicating ST species

The probability of successfully eradicating pests may have a significant impact on the deployment of traps. In

**TABLE 2** Impact of changes in trap costs.

| Trap cost                                                   | Trapping programming | Total expected cost (USD million) | Damage (USD million) | Trap cost (USD million) | Traps required (traps) | Trap density (traps/km <sup>2</sup> ) |
|-------------------------------------------------------------|----------------------|-----------------------------------|----------------------|-------------------------|------------------------|---------------------------------------|
| (a) Auckland (share of risk/km <sup>2</sup> = 0.22%) higher |                      |                                   |                      |                         |                        |                                       |
| ST cost 50%                                                 |                      |                                   |                      |                         |                        |                                       |
|                                                             | Doing nothing        | 4478                              | 4478                 |                         |                        |                                       |
|                                                             | GT only              | 858                               | 509                  | 348                     | 68,850                 | 317                                   |
|                                                             | ST only              | 2952                              | 2814                 | 139                     | 18,259                 | 84                                    |
|                                                             | GT and ST            | 841                               | 514                  | 327                     |                        |                                       |
|                                                             | GT                   |                                   |                      |                         | 51,772                 | 238                                   |
|                                                             | ST                   |                                   |                      |                         | 8552                   | 39                                    |
|                                                             | ST share             |                                   |                      |                         | 0.14                   |                                       |
| <i>Baseline</i>                                             |                      |                                   |                      |                         |                        |                                       |
|                                                             | <i>Doing nothing</i> | <i>4478</i>                       | <i>4478</i>          |                         |                        |                                       |
|                                                             | <i>GT only</i>       | <i>858</i>                        | <i>509</i>           | <i>348</i>              | <i>68,850</i>          | <i>317</i>                            |
|                                                             | <i>ST only</i>       | <i>2900</i>                       | <i>2782</i>          | <i>118</i>              | <i>23,336</i>          | <i>107</i>                            |
|                                                             | <i>GT and ST</i>     | <i>811</i>                        | <i>512</i>           | <i>300</i>              |                        |                                       |
|                                                             | <i>GT</i>            |                                   |                      |                         | <i>44,132</i>          | <i>203</i>                            |
|                                                             | <i>ST</i>            |                                   |                      |                         | <i>15,061</i>          | <i>69</i>                             |
|                                                             | <i>ST share</i>      |                                   |                      |                         | <i>0.25</i>            |                                       |
| GT cost 50% higher                                          |                      |                                   |                      |                         |                        |                                       |
|                                                             | Doing nothing        | 4478                              | 4478                 |                         |                        |                                       |
|                                                             | GT only              | 993                               | 677                  | 316                     | 41,638                 | 192                                   |
|                                                             | ST only              | 2900                              | 2782                 | 118                     | 23,336                 | 107                                   |
|                                                             | GT and ST            | 897                               | 595                  | 301                     |                        |                                       |
|                                                             | GT                   |                                   |                      |                         | 27,527                 | 127                                   |
|                                                             | ST                   |                                   |                      |                         | 18,174                 | 84                                    |
|                                                             | ST share             |                                   |                      |                         | 0.40                   |                                       |
| (b) Tauranga (share of risk/km <sup>2</sup> = 0.68%)        |                      |                                   |                      |                         |                        |                                       |
| ST cost 50% higher                                          |                      |                                   |                      |                         |                        |                                       |
|                                                             | Doing nothing        | 2115                              | 2115                 |                         |                        |                                       |
|                                                             | GT only              | 241                               | 122                  | 119                     | 23,490                 | 699                                   |
|                                                             | ST only              | 1337                              | 1299                 | 38                      | 4989                   | 148                                   |
|                                                             | GT and ST            | 240                               | 124                  | 117                     |                        |                                       |
|                                                             | GT                   |                                   |                      |                         | 21,420                 | 638                                   |
|                                                             | ST                   |                                   |                      |                         | 1000                   | 30                                    |
|                                                             | ST share             |                                   |                      |                         | 0.04                   |                                       |
| <i>Baseline</i>                                             |                      |                                   |                      |                         |                        |                                       |
|                                                             | <i>Doing nothing</i> | <i>2115</i>                       | <i>2115</i>          |                         |                        |                                       |
|                                                             | <i>GT only</i>       | <i>241</i>                        | <i>122</i>           | <i>119</i>              | <i>23,490</i>          | <i>699</i>                            |
|                                                             | <i>ST only</i>       | <i>1324</i>                       | <i>1294</i>          | <i>30</i>               | <i>5779</i>            | <i>172</i>                            |
|                                                             | <i>GT and ST</i>     | <i>237</i>                        | <i>125</i>           | <i>112</i>              |                        |                                       |
|                                                             | <i>GT</i>            |                                   |                      |                         | <i>19,981</i>          | <i>595</i>                            |
|                                                             | <i>ST</i>            |                                   |                      |                         | <i>2034</i>            | <i>61</i>                             |
|                                                             | <i>ST share</i>      |                                   |                      |                         | <i>0.09</i>            |                                       |

(Continues)

TABLE 2 (Continued)

| Trap cost                                               | Trapping programming | Total expected cost (USD million) | Damage (USD million) | Trap cost (USD million) | Traps required (traps) | Trap density (traps/km <sup>2</sup> ) |
|---------------------------------------------------------|----------------------|-----------------------------------|----------------------|-------------------------|------------------------|---------------------------------------|
| GT cost 50% higher                                      |                      |                                   |                      |                         |                        |                                       |
|                                                         | Doing nothing        | 2115                              | 2115                 |                         |                        |                                       |
|                                                         | GT only              | 294                               | 152                  | 142                     | 18,720                 | 557                                   |
|                                                         | ST only              | 1324                              | 1294                 | 30                      | 5779                   | 172                                   |
|                                                         | GT and ST            | 279                               | 156                  | 123                     |                        |                                       |
|                                                         | GT                   |                                   |                      |                         | 14,005                 | 417                                   |
|                                                         | ST                   |                                   |                      |                         | 3154                   | 94                                    |
|                                                         | ST share             |                                   |                      |                         | 0.18                   |                                       |
| (c) Christchurch (share of risk/km <sup>2</sup> = 0.1%) |                      |                                   |                      |                         |                        |                                       |
| ST cost 50% higher                                      |                      |                                   |                      |                         |                        |                                       |
|                                                         | Doing nothing        | 855                               | 855                  |                         |                        |                                       |
|                                                         | GT only              | 211                               | 154                  | 57                      | 11,167                 | 124                                   |
|                                                         | ST only              | 586                               | 558                  | 28                      | 3553                   | 39                                    |
|                                                         | GT and ST            | 210                               | 145                  | 65                      |                        |                                       |
|                                                         | GT                   |                                   |                      |                         | 10,130                 | 113                                   |
|                                                         | ST                   |                                   |                      |                         | 1653                   | 18                                    |
|                                                         | ST share             |                                   |                      |                         | 0.14                   |                                       |
| Baseline                                                |                      |                                   |                      |                         |                        |                                       |
|                                                         | Doing nothing        | 855                               | 855                  |                         |                        |                                       |
|                                                         | GT only              | 211                               | 154                  | 57                      | 11,167                 | 124                                   |
|                                                         | ST only              | 575                               | 545                  | 29                      | 5652                   | 63                                    |
|                                                         | GT and ST            | 203                               | 135                  | 68                      |                        |                                       |
|                                                         | GT                   |                                   |                      |                         | 9389                   | 104                                   |
|                                                         | ST                   |                                   |                      |                         | 3892                   | 43                                    |
|                                                         | ST share             |                                   |                      |                         | 0.29                   |                                       |
| GT cost 50% higher                                      |                      |                                   |                      |                         |                        |                                       |
|                                                         | Doing nothing        | 855                               | 855                  |                         |                        |                                       |
|                                                         | GT only              | 235                               | 172                  | 63                      | 8192                   | 91                                    |
|                                                         | ST only              | 575                               | 545                  | 29                      | 5652                   | 63                                    |
|                                                         | GT and ST            | 223                               | 146                  | 77                      |                        |                                       |
|                                                         | GT                   |                                   |                      |                         | 7229                   | 80                                    |
|                                                         | ST                   |                                   |                      |                         | 4297                   | 48                                    |
|                                                         | ST share             |                                   |                      |                         | 0.37                   |                                       |
| (d) Wellington (share of risk/km <sup>2</sup> = 0.09%)  |                      |                                   |                      |                         |                        |                                       |
| ST cost 50% higher                                      |                      |                                   |                      |                         |                        |                                       |
|                                                         | Doing nothing        | 745                               | 745                  |                         |                        |                                       |
|                                                         | GT only              | 190                               | 140                  | 50                      | 9875                   | 111                                   |
|                                                         | ST only              | 513                               | 491                  | 22                      | 2870                   | 32                                    |
|                                                         | GT and ST            | 190                               | 133                  | 56                      |                        |                                       |
|                                                         | GT                   |                                   |                      |                         | 9252                   | 104                                   |
|                                                         | ST                   |                                   |                      |                         | 1135                   | 13                                    |
|                                                         | ST share             |                                   |                      |                         | 0.11                   |                                       |

**TABLE 2** (Continued)

| Trap cost          | Trapping programming | Total expected cost (USD million) | Damage (USD million) | Trap cost (USD million) | Traps required (traps) | Trap density (traps/km <sup>2</sup> ) |
|--------------------|----------------------|-----------------------------------|----------------------|-------------------------|------------------------|---------------------------------------|
| <i>Baseline</i>    |                      |                                   |                      |                         |                        |                                       |
|                    | <i>Doing nothing</i> | 745                               | 745                  |                         |                        |                                       |
|                    | <i>GT only</i>       | 190                               | 140                  | 50                      | 9875                   | 111                                   |
|                    | <i>ST only</i>       | 504                               | 478                  | 26                      | 4939                   | 56                                    |
|                    | <i>GT and ST</i>     | 184                               | 123                  | 61                      |                        |                                       |
|                    | <i>GT</i>            |                                   |                      |                         | 8616                   | 97                                    |
|                    | <i>ST</i>            |                                   |                      |                         | 3324                   | 37                                    |
|                    | <i>ST share</i>      |                                   |                      |                         | 0.28                   |                                       |
| GT cost 50% higher |                      |                                   |                      |                         |                        |                                       |
|                    | Doing nothing        | 745                               | 745                  |                         |                        |                                       |
|                    | GT only              | 212                               | 154                  | 57                      | 7497                   | 84                                    |
|                    | ST only              | 504                               | 478                  | 26                      | 4939                   | 56                                    |
|                    | GT and ST            | 203                               | 133                  | 70                      |                        |                                       |
|                    | GT                   |                                   |                      |                         | 6700                   | 75                                    |
|                    | ST                   |                                   |                      |                         | 3683                   | 41                                    |
|                    | ST share             |                                   |                      |                         | 0.35                   |                                       |

Note: “GT only” denotes a trapping program that uses only generalized traps; “GT and ST” denotes a trapping program that potentially uses both generalized and specialized traps. The baseline results are in italics. All costs and damage are rounded to the nearest million USD.

Abbreviations: GT, generalized trap; ST, specialized trap.

**TABLE 3** Impact of changes in range of species that traps can capture.

| Trap capture range                                   | Trapping programming | Total expected cost (USD million) | Damage (USD million) | Trap cost (USD million) | Traps required (traps) | Trap density (traps/km <sup>2</sup> ) |
|------------------------------------------------------|----------------------|-----------------------------------|----------------------|-------------------------|------------------------|---------------------------------------|
| (a) Auckland (share of risk/km <sup>2</sup> = 0.22%) |                      |                                   |                      |                         |                        |                                       |
| ST species evenly distributed                        |                      |                                   |                      |                         |                        |                                       |
|                                                      | Doing nothing        | 4478                              | 4478                 |                         |                        |                                       |
|                                                      | GT only              | 858                               | 509                  | 348                     | 68,850                 | 317                                   |
|                                                      | ST only              | 4318                              | 4301                 | 18                      | 3404                   | 16                                    |
|                                                      | GT and ST            | 858                               | 509                  | 348                     |                        |                                       |
|                                                      | GT                   |                                   |                      |                         | 68,850                 | 317                                   |
|                                                      | ST                   |                                   |                      |                         | 0                      | 0                                     |
|                                                      | ST share             |                                   |                      |                         | 0.00                   |                                       |
| <i>Baseline</i>                                      |                      |                                   |                      |                         |                        |                                       |
|                                                      | <i>Doing nothing</i> | 4478                              | 4478                 |                         |                        |                                       |
|                                                      | <i>GT only</i>       | 858                               | 509                  | 348                     | 68,850                 | 317                                   |
|                                                      | <i>ST only</i>       | 2900                              | 2782                 | 118                     | 23,336                 | 107                                   |
|                                                      | <i>GT and ST</i>     | 811                               | 512                  | 300                     |                        |                                       |
|                                                      | <i>GT</i>            |                                   |                      |                         | 44,132                 | 203                                   |
|                                                      | <i>ST</i>            |                                   |                      |                         | 15,061                 | 69                                    |
|                                                      | <i>ST share</i>      |                                   |                      |                         | 0.25                   |                                       |

(Continues)

TABLE 3 (Continued)

| Trap capture range                                      | Trapping programming cost (USD million) | Total expected cost (USD million) | Damage (USD million) | Trap cost (USD million) | Traps required (traps) | Trap density (traps/km <sup>2</sup> ) |
|---------------------------------------------------------|-----------------------------------------|-----------------------------------|----------------------|-------------------------|------------------------|---------------------------------------|
| GT and STs mutually exclusive                           |                                         |                                   |                      |                         |                        |                                       |
| Doing nothing                                           |                                         | 4478                              | 4478                 |                         |                        |                                       |
| GT only                                                 |                                         | 2426                              | 2250                 | 176                     | 34,757                 | 160                                   |
| ST only                                                 |                                         | 2900                              | 2782                 | 118                     | 23,336                 | 107                                   |
| GT and ST                                               |                                         | 848                               | 554                  | 294                     |                        |                                       |
| GT                                                      |                                         |                                   |                      |                         | 34,757                 | 160                                   |
| ST                                                      |                                         |                                   |                      |                         | 23,336                 | 107                                   |
| ST share                                                |                                         |                                   |                      |                         | 0.40                   |                                       |
| (b) Tauranga (share of risk/km <sup>2</sup> = 0.68%)    |                                         |                                   |                      |                         |                        |                                       |
| ST species evenly distributed                           |                                         |                                   |                      |                         |                        |                                       |
| Doing nothing                                           |                                         | 2115                              | 2115                 |                         |                        |                                       |
| GT only                                                 |                                         | 241                               | 122                  | 119                     | 23,490                 | 699                                   |
| ST only                                                 |                                         | 2032                              | 2023                 | 9                       | 1577                   | 47                                    |
| GT and ST                                               |                                         | 241                               | 122                  | 119                     |                        |                                       |
| GT                                                      |                                         |                                   |                      |                         | 23,490                 | 699                                   |
| ST                                                      |                                         |                                   |                      |                         | 0                      | 0                                     |
| ST share                                                |                                         |                                   |                      |                         | 0.00                   |                                       |
| <i>Baseline</i>                                         |                                         |                                   |                      |                         |                        |                                       |
| <i>Doing nothing</i>                                    |                                         | <i>2115</i>                       | <i>2115</i>          |                         |                        |                                       |
| <i>GT only</i>                                          |                                         | <i>241</i>                        | <i>122</i>           | <i>119</i>              | <i>23,490</i>          | <i>699</i>                            |
| <i>ST only</i>                                          |                                         | <i>1324</i>                       | <i>1294</i>          | <i>30</i>               | <i>5779</i>            | <i>172</i>                            |
| <i>GT and ST</i>                                        |                                         | <i>237</i>                        | <i>125</i>           | <i>112</i>              |                        |                                       |
| <i>GT</i>                                               |                                         |                                   |                      |                         | <i>19,981</i>          | <i>595</i>                            |
| <i>ST</i>                                               |                                         |                                   |                      |                         | <i>2034</i>            | <i>61</i>                             |
| <i>ST share</i>                                         |                                         |                                   |                      |                         | <i>0.09</i>            |                                       |
| GT and STs mutually exclusive                           |                                         |                                   |                      |                         |                        |                                       |
| Doing nothing                                           |                                         | 2115                              | 2115                 |                         |                        |                                       |
| GT only                                                 |                                         | 1046                              | 958                  | 88                      | 17,359                 | 517                                   |
| ST only                                                 |                                         | 1324                              | 1294                 | 30                      | 5779                   | 172                                   |
| GT and ST                                               |                                         | 254                               | 137                  | 118                     |                        |                                       |
| GT                                                      |                                         |                                   |                      |                         | 17,359                 | 517                                   |
| ST                                                      |                                         |                                   |                      |                         | 5779                   | 172                                   |
| ST share                                                |                                         |                                   |                      |                         | 0.25                   |                                       |
| (c) Christchurch (share of risk/km <sup>2</sup> = 0.1%) |                                         |                                   |                      |                         |                        |                                       |
| ST species evenly distributed                           |                                         |                                   |                      |                         |                        |                                       |
| Doing nothing                                           |                                         | 855                               | 855                  |                         |                        |                                       |
| GT only                                                 |                                         | 211                               | 154                  | 57                      | 11,167                 | 124                                   |
| ST only                                                 |                                         | 828                               | 823                  | 6                       | 1000                   | 11                                    |
| GT and ST                                               |                                         | 211                               | 154                  | 57                      |                        |                                       |
| GT                                                      |                                         |                                   |                      |                         | 11,167                 | 124                                   |
| ST                                                      |                                         |                                   |                      |                         | 0                      | 0                                     |
| ST share                                                |                                         |                                   |                      |                         | 0.00                   |                                       |

TABLE 3 (Continued)

| Trap capture range                                     | Trapping programming | Total expected cost (USD million) | Damage (USD million) | Trap cost (USD million) | Traps required (traps) | Trap density (traps/km <sup>2</sup> ) |
|--------------------------------------------------------|----------------------|-----------------------------------|----------------------|-------------------------|------------------------|---------------------------------------|
| <i>Baseline</i>                                        |                      |                                   |                      |                         |                        |                                       |
|                                                        | <i>Doing nothing</i> | 855                               | 855                  |                         |                        |                                       |
|                                                        | <i>GT only</i>       | 211                               | 154                  | 57                      | 11,167                 | 124                                   |
|                                                        | <i>ST only</i>       | 575                               | 545                  | 29                      | 5652                   | 63                                    |
|                                                        | <i>GT and ST</i>     | 203                               | 135                  | 68                      |                        |                                       |
|                                                        | <i>GT</i>            |                                   |                      |                         | 9389                   | 104                                   |
|                                                        | <i>ST</i>            |                                   |                      |                         | 3892                   | 43                                    |
|                                                        | <i>ST share</i>      |                                   |                      |                         | 0.29                   |                                       |
| GT and STs mutually exclusive                          |                      |                                   |                      |                         |                        |                                       |
|                                                        | Doing nothing        | 855                               | 855                  |                         |                        |                                       |
|                                                        | GT only              | 492                               | 449                  | 43                      | 8339                   | 93                                    |
|                                                        | ST only              | 575                               | 545                  | 29                      | 5652                   | 63                                    |
|                                                        | GT and ST            | 211                               | 140                  | 71                      |                        |                                       |
|                                                        | GT                   |                                   |                      |                         | 8339                   | 93                                    |
|                                                        | ST                   |                                   |                      |                         | 5652                   | 63                                    |
|                                                        | ST share             |                                   |                      |                         | 0.40                   |                                       |
| (d) Wellington (share of risk/km <sup>2</sup> = 0.09%) |                      |                                   |                      |                         |                        |                                       |
| ST species evenly distributed                          |                      |                                   |                      |                         |                        |                                       |
|                                                        | Doing nothing        | 745                               | 745                  |                         |                        |                                       |
|                                                        | GT only              | 190                               | 140                  | 50                      | 9875                   | 111                                   |
|                                                        | ST only              | 722                               | 717                  | 5                       | 957                    | 11                                    |
|                                                        | GT and ST            | 190                               | 140                  | 50                      |                        |                                       |
|                                                        | GT                   |                                   |                      |                         | 9875                   | 111                                   |
|                                                        | ST                   |                                   |                      |                         | 0                      | 0                                     |
|                                                        | ST share             |                                   |                      |                         | 0.00                   |                                       |
| <i>Baseline</i>                                        |                      |                                   |                      |                         |                        |                                       |
|                                                        | <i>Doing nothing</i> | 745                               | 745                  |                         |                        |                                       |
|                                                        | <i>GT only</i>       | 190                               | 140                  | 50                      | 9875                   | 111                                   |
|                                                        | <i>ST only</i>       | 504                               | 478                  | 26                      | 4939                   | 56                                    |
|                                                        | <i>GT and ST</i>     | 184                               | 123                  | 61                      |                        |                                       |
|                                                        | <i>GT</i>            |                                   |                      |                         | 8616                   | 97                                    |
|                                                        | <i>ST</i>            |                                   |                      |                         | 3324                   | 37                                    |
|                                                        | <i>ST share</i>      |                                   |                      |                         | 0.28                   |                                       |
| GT and STs mutually exclusive                          |                      |                                   |                      |                         |                        |                                       |
|                                                        | Doing nothing        | 745                               | 745                  |                         |                        |                                       |
|                                                        | GT only              | 433                               | 394                  | 39                      | 7696                   | 87                                    |
|                                                        | ST only              | 504                               | 478                  | 26                      | 4939                   | 56                                    |
|                                                        | GT and ST            | 192                               | 127                  | 65                      |                        |                                       |
|                                                        | GT                   |                                   |                      |                         | 7696                   | 87                                    |
|                                                        | ST                   |                                   |                      |                         | 4939                   | 56                                    |
|                                                        | ST share             |                                   |                      |                         | 0.39                   |                                       |

Note: "GT only" denotes a trapping program that uses only generalized traps; "GT and ST" denotes a trapping program that potentially uses both generalized and specialized traps. The baseline results are in italics. All costs and damage are rounded to nearest million USD.

Abbreviations: GT, generalized trap; ST, specialized trap.

**TABLE 4** Impact of species that cannot be trapped and changes in ST species eradication probability.

| TD and STSEP                                         | Trapping programming | Total expected cost (USD million) | Damage (USD million) | Trap cost (USD million) | Traps required (traps) | Trap density (traps/km <sup>2</sup> ) |
|------------------------------------------------------|----------------------|-----------------------------------|----------------------|-------------------------|------------------------|---------------------------------------|
| (a) Auckland (share of risk/km <sup>2</sup> = 0.22%) |                      |                                   |                      |                         |                        |                                       |
| Percentage NT                                        |                      |                                   |                      |                         |                        |                                       |
|                                                      | Doing nothing        | 4478                              | 4478                 |                         |                        |                                       |
|                                                      | GT only              | 1643                              | 1374                 | 269                     | 53,166                 | 245                                   |
|                                                      | ST only              | 2900                              | 2782                 | 118                     | 23,336                 | 107                                   |
|                                                      | GT and ST            | 1562                              | 1323                 | 239                     |                        |                                       |
|                                                      | GT                   |                                   |                      |                         | 29,260                 | 135                                   |
|                                                      | ST                   |                                   |                      |                         | 17,849                 | 82                                    |
|                                                      | ST share             |                                   |                      |                         | 0.38                   |                                       |
| <i>Baseline</i>                                      |                      |                                   |                      |                         |                        |                                       |
|                                                      | <i>Doing nothing</i> | <i>4478</i>                       | <i>4478</i>          |                         |                        |                                       |
|                                                      | <i>GT only</i>       | <i>858</i>                        | <i>509</i>           | <i>348</i>              | <i>68,850</i>          | <i>317</i>                            |
|                                                      | <i>ST only</i>       | <i>2900</i>                       | <i>2782</i>          | <i>118</i>              | <i>23,336</i>          | <i>107</i>                            |
|                                                      | <i>GT and ST</i>     | <i>811</i>                        | <i>512</i>           | <i>300</i>              |                        |                                       |
|                                                      | <i>GT</i>            |                                   |                      |                         | <i>44,132</i>          | <i>203</i>                            |
|                                                      | <i>ST</i>            |                                   |                      |                         | <i>15,061</i>          | <i>69</i>                             |
|                                                      | <i>ST share</i>      |                                   |                      |                         | <i>0.25</i>            |                                       |
| ST species eradication probability 50% higher        |                      |                                   |                      |                         |                        |                                       |
|                                                      | Doing nothing        | 4478                              | 4478                 |                         |                        |                                       |
|                                                      | GT only              | 759                               | 513                  | 246                     | 48,574                 | 224                                   |
|                                                      | ST only              | 2845                              | 2782                 | 64                      | 12,477                 | 57                                    |
|                                                      | GT and ST            | 756                               | 511                  | 245                     |                        |                                       |
|                                                      | GT                   |                                   |                      |                         | 44,132                 | 203                                   |
|                                                      | ST                   |                                   |                      |                         | 4202                   | 19                                    |
|                                                      | ST share             |                                   |                      |                         | 0.09                   |                                       |
| (b) Tauranga (share of risk/km <sup>2</sup> = 0.68%) |                      |                                   |                      |                         |                        |                                       |
| Percentage NT                                        |                      |                                   |                      |                         |                        |                                       |
|                                                      | Doing nothing        | 2115                              | 2115                 |                         |                        |                                       |
|                                                      | GT only              | 638                               | 533                  | 106                     | 20,848                 | 620                                   |
|                                                      | ST only              | 1324                              | 1294                 | 30                      | 5779                   | 172                                   |
|                                                      | GT and ST            | 627                               | 537                  | 90                      |                        |                                       |
|                                                      | GT                   |                                   |                      |                         | 14,723                 | 438                                   |
|                                                      | ST                   |                                   |                      |                         | 3019                   | 90                                    |
|                                                      | ST share             |                                   |                      |                         | 0.17                   |                                       |
| <i>Baseline</i>                                      |                      |                                   |                      |                         |                        |                                       |
|                                                      | <i>Doing nothing</i> | <i>2115</i>                       | <i>2115</i>          |                         |                        |                                       |
|                                                      | <i>GT only</i>       | <i>241</i>                        | <i>122</i>           | <i>119</i>              | <i>23,490</i>          | <i>699</i>                            |
|                                                      | <i>ST only</i>       | <i>1324</i>                       | <i>1294</i>          | <i>30</i>               | <i>5779</i>            | <i>172</i>                            |
|                                                      | <i>GT and ST</i>     | <i>237</i>                        | <i>125</i>           | <i>112</i>              |                        |                                       |
|                                                      | <i>GT</i>            |                                   |                      |                         | <i>19,981</i>          | <i>595</i>                            |

TABLE 4 (Continued)

| TD and STSEP                                  | Trapping programming | Total expected cost (USD million) | Damage (USD million) | Trap cost (USD million) | Traps required (traps) | Trap density (traps/km <sup>2</sup> ) |
|-----------------------------------------------|----------------------|-----------------------------------|----------------------|-------------------------|------------------------|---------------------------------------|
| ST species eradication probability 50% higher | ST                   |                                   |                      |                         | 2034                   | 61                                    |
|                                               | ST share             |                                   |                      |                         | 0.09                   |                                       |
|                                               | Doing nothing        | 2115                              | 2115                 |                         |                        |                                       |
|                                               | GT only              | 228                               | 124                  | 104                     | 20,427                 | 608                                   |
|                                               | ST only              | 1315                              | 1294                 | 21                      | 4099                   | 122                                   |
|                                               | GT and ST            | 228                               | 124                  | 104                     |                        |                                       |
|                                               | GT                   |                                   |                      |                         | 20,427                 | 608                                   |
|                                               | ST                   |                                   |                      |                         | 0                      | 0                                     |
|                                               | ST share             |                                   |                      |                         | 0.00                   |                                       |

(c) Christchurch (share of risk/km<sup>2</sup> = 0.1%)

## Percentage NT

|               |     |     |    |      |     |  |
|---------------|-----|-----|----|------|-----|--|
| Doing nothing | 855 | 855 |    |      |     |  |
| GT only       | 350 | 303 | 47 | 9274 | 103 |  |
| ST only       | 575 | 545 | 29 | 5652 | 63  |  |
| GT and ST     | 340 | 279 | 61 |      |     |  |
| GT            |     |     |    | 7777 | 86  |  |
| ST            |     |     |    | 4194 | 47  |  |
| ST share      |     |     |    | 0.35 |     |  |

## Baseline

|               |     |     |    |        |     |  |
|---------------|-----|-----|----|--------|-----|--|
| Doing nothing | 855 | 855 |    |        |     |  |
| GT only       | 211 | 154 | 57 | 11,167 | 124 |  |
| ST only       | 575 | 545 | 29 | 5652   | 63  |  |
| GT and ST     | 203 | 135 | 68 |        |     |  |
| GT            |     |     |    | 9389   | 104 |  |
| ST            |     |     |    | 3892   | 43  |  |
| ST share      |     |     |    | 0.29   |     |  |

## ST species eradication probability 50% higher

|               |     |     |    |      |     |  |
|---------------|-----|-----|----|------|-----|--|
| Doing nothing | 855 | 855 |    |      |     |  |
| GT only       | 180 | 132 | 48 | 9400 | 104 |  |
| ST only       | 552 | 542 | 10 | 1774 | 20  |  |
| GT and ST     | 180 | 132 | 48 |      |     |  |
| GT            |     |     |    | 9400 | 104 |  |
| ST            |     |     |    | 0    | 0   |  |
| ST share      |     |     |    | 0.00 |     |  |

(d) Wellington (share of risk/km<sup>2</sup> = 0.09%)

## Percentage NT

|               |     |     |    |      |    |  |
|---------------|-----|-----|----|------|----|--|
| Doing nothing | 745 | 745 |    |      |    |  |
| GT only       | 311 | 268 | 43 | 8389 | 94 |  |

(Continues)

**TABLE 4** (Continued)

| TD and STSEP    | Trapping programming                          | Total expected cost (USD million) | Damage (USD million) | Trap cost (USD million) | Traps required (traps) | Trap density (traps/km <sup>2</sup> ) |
|-----------------|-----------------------------------------------|-----------------------------------|----------------------|-------------------------|------------------------|---------------------------------------|
| <i>Baseline</i> | ST only                                       | 504                               | 478                  | 26                      | 4939                   | 56                                    |
|                 | GT and ST                                     | 303                               | 247                  | 55                      |                        |                                       |
|                 | GT                                            |                                   |                      |                         | 7212                   | 81                                    |
|                 | ST                                            |                                   |                      |                         | 3587                   | 40                                    |
|                 | ST share                                      |                                   |                      |                         | 0.33                   |                                       |
|                 | <i>Doing nothing</i>                          | 745                               | 745                  |                         |                        |                                       |
|                 | <i>GT only</i>                                | 190                               | 140                  | 50                      | 9875                   | 111                                   |
|                 | <i>ST only</i>                                | 504                               | 478                  | 26                      | 4939                   | 56                                    |
|                 | <i>GT and ST</i>                              | 184                               | 123                  | 61                      |                        |                                       |
|                 | <i>GT</i>                                     |                                   |                      |                         | 8616                   | 97                                    |
|                 | <i>ST</i>                                     |                                   |                      |                         | 3324                   | 37                                    |
|                 | <i>ST share</i>                               |                                   |                      |                         | 0.28                   |                                       |
|                 | ST species eradication probability 50% higher |                                   |                      |                         |                        |                                       |
|                 | Doing nothing                                 | 745                               | 745                  |                         |                        |                                       |
|                 | GT only                                       | 162                               | 118                  | 44                      | 8603                   | 97                                    |
|                 | ST only                                       | 482                               | 473                  | 9                       | 1600                   | 18                                    |
|                 | GT and ST                                     | 162                               | 118                  | 44                      |                        |                                       |
|                 | GT                                            |                                   |                      |                         | 8603                   | 97                                    |
|                 | ST                                            |                                   |                      |                         | 0                      | 0                                     |
|                 | ST share                                      |                                   |                      |                         | 0.00                   |                                       |

Note: “GT only” denotes a trapping program that uses only generalized traps; “GT and ST” denotes a trapping program that potentially uses both generalized and specialized traps. The baseline results are in italics. All costs and damages are rounded to the nearest million USD.

Abbreviations: GT, generalized trap; ST, specialized trap; STSEP, ST Species Eradication Probability; TD trap detectability.

this context, we focus only on highly damaging species that STs can catch. We increased the likelihood of successful eradication by 50% compared to the baseline scenario. As shown in Table 4, TECs decreased in all regions, but using STs is no longer economically efficient in any area except Auckland. This result may seem counterintuitive at first, but it makes sense because, in this scenario, the detection of ST species was not affected, and it was easier to eradicate them than in the baseline scenario. Consequently, delaying detection is less costly for ST species in this scenario, reducing the benefits of trapping for them.

### Impact of changes in trap sensitivity

The efficiency of a specific type of trap in capturing particular species, referred to as trap sensitivity, can influence the traps’ allocation and, ultimately, the economic

outcomes of the pest management program. In this study, we examined the impact of this variable through two different scenarios. In the first scenario, we enhanced the sensitivity of STs from 80% to 90%. In the second scenario, we decreased the sensitivity of GTs from 15% to 10%.

As expected, increasing ST sensitivity and decreasing GT sensitivity resulted in lower and higher TECs, respectively (Table 5). However, the impact on the share of STs was more nuanced. We observed a uniform increase in ST shares across all regions as ST sensitivity increased. In contrast, when GT sensitivity decreased, ST shares increased in high-risk areas, namely, Auckland and Tauranga, but marginally decreased in low-risk areas, namely, Christchurch and Wellington. These results highlight two important implications. First, there is a substitution effect between the two trap types, and second, the use of GTs is less sensitive to their detectability in low-risk regions.

**TABLE 5** Impact of changes in trap sensitivity.

| Sensitivity                                          | Trapping programming | Total expected cost (USD million) | Damage (USD million) | Trap cost (USD million) | Traps required (traps) | Trap density (traps/km <sup>2</sup> ) |
|------------------------------------------------------|----------------------|-----------------------------------|----------------------|-------------------------|------------------------|---------------------------------------|
| (a) Auckland (share of risk/km <sup>2</sup> = 0.22%) |                      |                                   |                      |                         |                        |                                       |
| ST 10% higher sensitivity                            |                      |                                   |                      |                         |                        |                                       |
|                                                      | Doing nothing        | 4478                              | 4478                 |                         |                        |                                       |
|                                                      | GT only              | 858                               | 509                  | 348                     | 68,850                 | 317                                   |
|                                                      | ST only              | 2887                              | 2775                 | 112                     | 22,055                 | 102                                   |
|                                                      | GT and ST            | 803                               | 510                  | 292                     |                        |                                       |
|                                                      | GT                   |                                   |                      |                         | 42,742                 | 197                                   |
|                                                      | ST                   |                                   |                      |                         | 14,931                 | 69                                    |
|                                                      | ST share             |                                   |                      |                         | 0.26                   |                                       |
| <i>Baseline</i>                                      |                      |                                   |                      |                         |                        |                                       |
|                                                      | <i>Doing nothing</i> | <i>4478</i>                       | <i>4478</i>          |                         |                        |                                       |
|                                                      | <i>GT only</i>       | <i>858</i>                        | <i>509</i>           | <i>348</i>              | <i>68,850</i>          | <i>317</i>                            |
|                                                      | <i>ST only</i>       | <i>2900</i>                       | <i>2782</i>          | <i>118</i>              | <i>23,336</i>          | <i>107</i>                            |
|                                                      | <i>GT and ST</i>     | <i>811</i>                        | <i>512</i>           | <i>300</i>              |                        |                                       |
|                                                      | <i>GT</i>            |                                   |                      |                         | <i>44,132</i>          | <i>203</i>                            |
|                                                      | <i>ST</i>            |                                   |                      |                         | <i>15,061</i>          | <i>69</i>                             |
|                                                      | <i>ST share</i>      |                                   |                      |                         | <i>0.25</i>            |                                       |
| GT 5% lower sensitivity                              |                      |                                   |                      |                         |                        |                                       |
|                                                      | Doing nothing        | 4478                              | 4478                 |                         |                        |                                       |
|                                                      | GT only              | 993                               | 677                  | 316                     | 62,458                 | 288                                   |
|                                                      | ST only              | 2900                              | 2782                 | 118                     | 23,336                 | 107                                   |
|                                                      | GT and ST            | 897                               | 595                  | 301                     |                        |                                       |
|                                                      | GT                   |                                   |                      |                         | 41,292                 | 190                                   |
|                                                      | ST                   |                                   |                      |                         | 18,174                 | 84                                    |
|                                                      | ST share             |                                   |                      |                         | 0.31                   |                                       |
| (b) Tauranga (share of risk/km <sup>2</sup> = 0.68%) |                      |                                   |                      |                         |                        |                                       |
| ST 10% higher sensitivity                            |                      |                                   |                      |                         |                        |                                       |
|                                                      | Doing nothing        | 2115                              | 2115                 |                         |                        |                                       |
|                                                      | GT only              | 241                               | 122                  | 119                     | 23,490                 | 699                                   |
|                                                      | ST only              | 1320                              | 1293                 | 28                      | 5342                   | 159                                   |
|                                                      | GT and ST            | 235                               | 125                  | 111                     |                        |                                       |
|                                                      | GT                   |                                   |                      |                         | 19,658                 | 585                                   |
|                                                      | ST                   |                                   |                      |                         | 2066                   | 61                                    |
|                                                      | ST share             |                                   |                      |                         | 0.10                   |                                       |
| <i>Baseline</i>                                      |                      |                                   |                      |                         |                        |                                       |
|                                                      | <i>Doing nothing</i> | <i>2115</i>                       | <i>2115</i>          |                         |                        |                                       |
|                                                      | <i>GT only</i>       | <i>241</i>                        | <i>122</i>           | <i>119</i>              | <i>23,490</i>          | <i>699</i>                            |
|                                                      | <i>ST only</i>       | <i>1324</i>                       | <i>1294</i>          | <i>30</i>               | <i>5779</i>            | <i>172</i>                            |
|                                                      | <i>GT and ST</i>     | <i>237</i>                        | <i>125</i>           | <i>112</i>              |                        |                                       |
|                                                      | <i>GT</i>            |                                   |                      |                         | <i>19,981</i>          | <i>595</i>                            |
|                                                      | <i>ST</i>            |                                   |                      |                         | <i>2034</i>            | <i>61</i>                             |
|                                                      | <i>ST share</i>      |                                   |                      |                         | <i>0.09</i>            |                                       |

(Continues)

TABLE 5 (Continued)

| Sensitivity                                             | Trapping programming | Total expected cost (USD million) | Damage (USD million) | Trap cost (USD million) | Traps required (traps) | Trap density (traps/km <sup>2</sup> ) |
|---------------------------------------------------------|----------------------|-----------------------------------|----------------------|-------------------------|------------------------|---------------------------------------|
| GT 5% lower sensitivity                                 |                      |                                   |                      |                         |                        |                                       |
|                                                         | Doing nothing        | 2115                              | 2115                 |                         |                        |                                       |
|                                                         | GT only              | 294                               | 152                  | 142                     | 28,080                 | 836                                   |
|                                                         | ST only              | 1324                              | 1294                 | 30                      | 5779                   | 172                                   |
|                                                         | GT and ST            | 279                               | 156                  | 123                     |                        |                                       |
|                                                         | GT                   |                                   |                      |                         | 21,007                 | 625                                   |
|                                                         | ST                   |                                   |                      |                         | 3154                   | 94                                    |
|                                                         | T share              |                                   |                      |                         | 0.13                   |                                       |
| (c) Christchurch (share of risk/km <sup>2</sup> = 0.1%) |                      |                                   |                      |                         |                        |                                       |
| ST 10% higher sensitivity                               |                      |                                   |                      |                         |                        |                                       |
|                                                         | Doing nothing        | 855                               | 855                  |                         |                        |                                       |
|                                                         | GT only              | 211                               | 154                  | 57                      | 11,167                 | 124                                   |
|                                                         | ST only              | 571                               | 542                  | 29                      | 5567                   | 62                                    |
|                                                         | GT and ST            | 200                               | 133                  | 68                      |                        |                                       |
|                                                         | GT                   |                                   |                      |                         | 9248                   | 103                                   |
|                                                         | ST                   |                                   |                      |                         | 4026                   | 45                                    |
|                                                         | ST share             |                                   |                      |                         | 0.30                   |                                       |
| <i>Baseline</i>                                         |                      |                                   |                      |                         |                        |                                       |
|                                                         | <i>Doing nothing</i> | <i>855</i>                        | <i>855</i>           |                         |                        |                                       |
|                                                         | <i>GT only</i>       | <i>211</i>                        | <i>154</i>           | <i>57</i>               | <i>11,167</i>          | <i>124</i>                            |
|                                                         | <i>ST only</i>       | <i>575</i>                        | <i>545</i>           | <i>29</i>               | <i>5652</i>            | <i>63</i>                             |
|                                                         | <i>GT and ST</i>     | <i>203</i>                        | <i>135</i>           | <i>68</i>               |                        |                                       |
|                                                         | <i>GT</i>            |                                   |                      |                         | <i>9389</i>            | <i>104</i>                            |
|                                                         | <i>ST</i>            |                                   |                      |                         | <i>3892</i>            | <i>43</i>                             |
|                                                         | <i>ST share</i>      |                                   |                      |                         | <i>0.29</i>            |                                       |
| GT 5% lower sensitivity                                 |                      |                                   |                      |                         |                        |                                       |
|                                                         | Doing nothing        | 855                               | 855                  |                         |                        |                                       |
|                                                         | GT only              | 235                               | 172                  | 63                      | 12,289                 | 137                                   |
|                                                         | ST only              | 575                               | 545                  | 29                      | 5652                   | 63                                    |
|                                                         | GT and ST            | 223                               | 146                  | 77                      |                        |                                       |
|                                                         | GT                   |                                   |                      |                         | 10,845                 | 121                                   |
|                                                         | ST                   |                                   |                      |                         | 4297                   | 48                                    |
|                                                         | ST share             |                                   |                      |                         | 0.28                   |                                       |
| (d) Wellington (share of risk/km <sup>2</sup> = 0.09%)  |                      |                                   |                      |                         |                        |                                       |
| ST 10% higher sensitivity                               |                      |                                   |                      |                         |                        |                                       |
|                                                         | Doing nothing        | 745                               | 745                  |                         |                        |                                       |
|                                                         | GT only              | 190                               | 140                  | 50                      | 9875                   | 111                                   |
|                                                         | ST only              | 501                               | 475                  | 25                      | 4926                   | 55                                    |
|                                                         | GT and ST            | 182                               | 121                  | 61                      |                        |                                       |
|                                                         | GT                   |                                   |                      |                         | 8494                   | 96                                    |
|                                                         | ST                   |                                   |                      |                         | 3510                   | 40                                    |
|                                                         | ST share             |                                   |                      |                         | 0.29                   |                                       |

**TABLE 5** (Continued)

| Sensitivity             | Trapping programming | Total expected cost (USD million) | Damage (USD million) | Trap cost (USD million) | Traps required (traps) | Trap density (traps/km <sup>2</sup> ) |
|-------------------------|----------------------|-----------------------------------|----------------------|-------------------------|------------------------|---------------------------------------|
| <i>Baseline</i>         |                      |                                   |                      |                         |                        |                                       |
|                         | <i>Doing nothing</i> | 745                               | 745                  |                         |                        |                                       |
|                         | <i>GT only</i>       | 190                               | 140                  | 50                      | 9875                   | 111                                   |
|                         | <i>ST only</i>       | 504                               | 478                  | 26                      | 4939                   | 56                                    |
|                         | <i>GT and ST</i>     | 184                               | 123                  | 61                      |                        |                                       |
|                         | <i>GT</i>            |                                   |                      |                         | 8616                   | 97                                    |
|                         | <i>ST</i>            |                                   |                      |                         | 3324                   | 37                                    |
|                         | <i>ST share</i>      |                                   |                      |                         | 0.28                   |                                       |
| GT 5% lower sensitivity |                      |                                   |                      |                         |                        |                                       |
|                         | Doing nothing        | 745                               | 745                  |                         |                        |                                       |
|                         | GT only              | 212                               | 154                  | 57                      | 11,246                 | 127                                   |
|                         | ST only              | 504                               | 478                  | 26                      | 4939                   | 56                                    |
|                         | GT and ST            | 203                               | 133                  | 70                      |                        |                                       |
|                         | GT                   |                                   |                      |                         | 10,051                 | 113                                   |
|                         | ST                   |                                   |                      |                         | 3683                   | 41                                    |
|                         | ST share             |                                   |                      |                         | 0.27                   |                                       |

Note: “GT only” denotes a trapping program that uses only generalized traps; “GT and ST” denotes a trapping program that potentially uses both generalized and specialized traps. The baseline results are in italics. All costs and damage are rounded to the nearest million USD.

Abbreviations: GT, generalized trap; ST, specialized trap.

Lastly, we investigated how the model results fluctuated with a broader variation in ST sensitivity, ranging from 30% to 90%. Appendix S4: Figure S1 illustrates the impact on TEC and the proportion of STs required in integrated programs. Within the baseline scenario, where GTs can capture all species detectable by STs, albeit with lower sensitivity, STs must demonstrate high effectiveness to be included in integrated programs. Indeed, in the riskiest region, Tauranga, STs necessitate a sensitivity of 45% or higher to be considered, and even at a 90% sensitivity level, their share does not exceed 10% of the total traps required. In contrast, in other regions, STs necessitate a comparable level of sensitivity to be included, potentially constituting up to 30% of the total traps in integrated schemes.

## DISCUSSION

Surveillance is used for several purposes in national surveillance programs (Kalaris et al., 2014). However, its most important objective is to detect newly founded populations early enough to facilitate their eradication (Kean et al., 2015). Two approaches to surveillance are often recognized: passive surveillance, which utilizes

existing information (e.g., data mining from biodiversity samples or citizen observations), and directed surveillance, which applies methods (e.g., traps, molecular sensors) that target individual species or groups of species (Anderson et al., 2017). In this paper, we focus on directed surveillance and explore its optimization for use in detecting plant pests.

Due to the high cost of implementing national surveillance systems and their importance to the success of biosecurity programs, there are major incentives in designing these systems to be cost effective. Several approaches have been taken in the optimization of surveillance systems (Koch et al., 2020). One approach has been to identify optimal strategies that minimize surveillance expenditures while simultaneously minimizing damage that occurs when surveillance fails (e.g., Holden et al., 2016; Yemshanov et al., 2019). Other approaches to surveillance optimization, such as those adopted here, minimize surveillance costs along with eradication costs (e.g., Epanchin-Niell et al., 2012; Hauser & McCarthy, 2009; Kompas et al., 2023).

While early efforts to identify optimal surveillance strategies relied on several simplifying assumptions to keep the problem tractable, recent work has been able to account for more realistic complexities that make this work more applicable. These complexities have included

accounting for uncertainty in underlying biological parameters (Horie et al., 2013), accounting for spatial variation in detection costs (Moore & McCarthy, 2016), and accounting for travel routes to surveillance locations (Yemshanov et al., 2020). Only a few studies have attempted to optimize surveillance programs that focus on the detection of multiple species (Epanchin-Niell et al., 2014; Jarrad et al., 2011). But to date there have been no published attempts, to the best of our knowledge, to optimize surveillance for multiple species by allocating surveillance effort among various types of detection tools, even though practical implementation of surveillance often demands the selection of tools (e.g., traps) of varying specificity and cost (Poland & Rassati, 2019).

In this study, we investigated whether using a combination of trap types that differed in their specificity for detecting species could enhance the efficiency of invasive surveillance programs. We explored the trade-offs among the use of different trap types by applying a bioeconomic surveillance model to manage bark- and wood-boring insect species in New Zealand. These species are among the most serious groups of forest pests worldwide (Aukema et al., 2011; Lieutier et al., 2004), and they vary substantially in their detectability by different lures and survey methods. Our findings illustrate the context dependence of their complementarity and substitutability, with the relative importance of each trap type depending on the attributes of the traps and the invasion contexts.

We found that the wide deployment of GTs is economically justified—even if they are generally less sensitive than STs—because GTs detect a wider range of species. However, the inclusion of STs is optimal across most of the contexts that we explored because of their greater sensitivity for detecting more damaging species.

The relative efficiency of STs, however, is quite dependent on their cost and sensitivity compared to GTs and, predominantly, the coverage capacity of GTs. The lower sensitivity or higher costs of a particular type of trap tend to reduce that type's relative use but can increase overall trapping investments. Thus, the relative price and detectability between the two trap types will, by and large, determine their optimal combination. But the marginal impact of the change caused by GTs on model outcomes is expected to be much more significant due to their extensive coverage. Furthermore, high arrival rates by invasive species generally make it more economical to blanket landscapes with GTs as they can detect a broader range of species. Finally, the higher the chance of successfully eradicating insects that specialized tools can catch, the less likely the tools will be required because delaying detection becomes less costly for these species.

One limitation of our analysis is that we only considered two categories of surveillance tools, but in reality, there may be a larger array of tools available. This would obviously make the selection of an optimal mixture of surveillance tools more complex. While many scolytine species utilize species-specific compounds for chemical communication, other species share certain compounds, and in some cases a single compound or blend of compounds may be attractive to multiple species (Raffa et al., 2015). For example, most North American *Ips* species are attracted to the blend of compounds used by the European spruce bark beetle, *Ips typographus*, for aggregation (Rabaglia et al., 2019). Also, in some cases, it is possible to utilize a single trap that is baited with multiple lures, each highly specific for multiple pests (Chase et al., 2018; Moir et al., 2022). This may represent a situation intermediate between the GT and ST methods considered here. Furthermore, our analysis assumed that there was no trend of association between the availability of specialized traps for a given species and the cost of the impact of a species. In reality, this often may not be the case because research on semiochemicals and trapping technologies often focuses on high-impact species. When pests are anticipated to have lower impacts, highly specific attractants may not be available.

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## CONFLICT OF INTEREST STATEMENT

The authors declare no conflicts of interest.

## DATA AVAILABILITY STATEMENT

All data and statistical code (Nguyen et al., 2023) are available from the Open Science Framework at <https://osf.io/38scx/>. Data used for this research were obtained from published and publicly available sources as listed in Appendices S2 and S3.

## ORCID

Hoa-Thi-Minh Nguyen  <https://orcid.org/0000-0002-9237-7731>

Long Chu  <https://orcid.org/0000-0002-2954-0575>  
 Andrew M. Liebhold  <https://orcid.org/0000-0001-7427-6534>  
 Rebecca Epanchin-Niell  <https://orcid.org/0000-0002-1454-5453>  
 John M. Kean  <https://orcid.org/0000-0002-4012-1048>  
 Tom Kompas  <https://orcid.org/0000-0002-0665-0966>  
 Andrew P. Robinson  <https://orcid.org/0000-0002-0509-6043>  
 Eckehard G. Brockerhoff  <https://orcid.org/0000-0002-5962-3208>  
 Joslin L. Moore  <https://orcid.org/0000-0001-9809-5092>

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## SUPPORTING INFORMATION

Additional supporting information can be found online in the Supporting Information section at the end of this article.

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