

## Short Report

## Evaluating a community-based public health intervention using a complex systems approach

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## ABSTRACT

**Background** This article outlines the methods being used to evaluate a community-based public health intervention. This evaluation approach recognizes that not only is the intervention, Healthy Families NZ, complex, but the social systems within which it is being implemented are complex.

**Methods** To address challenges related to complexity, we discuss three developing areas within evaluation theory and apply them to an evaluation case example. The example, Healthy Families NZ, aims to strengthen the prevention system in Aotearoa/New Zealand to prevent chronic disease in 10 different geographic areas. Central to the evaluation design is the comparative case method which recognizes that emergent outcomes are the result of 'configurations of causes'. 'Thick', mixed-data, case studies are developed, with each case considered a view of a complex system. Qualitative Comparative Analysis is the analytical approach used to systematically compare the cases over time.

**Conclusions** This article describes an approach to evaluating a community-based public health intervention that considers the social systems in which the initiative is being implemented to be complex. The evaluation case example provides a unique opportunity to operationalize and test these methods, while extending their more frequent use within other fields to the field of public health.

**Keywords** case study, community health, comparison, complexity, evaluation, health promotion, intervention effectiveness, public health, systems thinking, theory

## Background

This article describes the methods being used to evaluate a community-based public health intervention. The approach described recognizes that not only is the intervention, Healthy Families NZ, complex, but the social systems within which it is being implemented are complex. This article contributes to the argument that this distinction, about where the complexity lies, is significant for selecting the most appropriate evaluation methods to use.<sup>1–3</sup>

'Complexity theory' underpins the understanding of social complexity conveyed in this article. Complexity theory was developed during the 1980s. Although new as coherent theories, complexity, and its predecessor chaos theory, were the

culmination of more than a century of scientific ruminations, experimentation and theorizing on the behaviour and organization of matter.<sup>4–6</sup> Since the 1990s complexity theory began a transition of influencing thinking in a range of social

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sciences.<sup>7,8</sup> This influence has been separate to, but mutually reinforcing with various systems theories which have a longer history of influence through operational research and systems design.<sup>9</sup>

Within public health a trickle of interest in the 1990s has turned into a river—with the theory and its utility becoming more widely accepted.<sup>10,11</sup> Some have described these recent developments as the ‘complexity turn’, and argue that the theory offers the social sciences a valid framing for empirical studies into diversity and social change.<sup>12–15</sup> The basics of complexity theory as applied to social systems are now well described in multiple publications.<sup>8,16–19</sup> Fundamentally, complexity theory sees social phenomena, such as increasing rates of childhood obesity,<sup>20</sup> as the ‘emergent’ result of interacting elements within a social system.<sup>8</sup> The emergent social phenomena are real in that they have an impact on people, the systems that generated them, and other interacting systems.<sup>21</sup> For public health evaluation some implications of the theory are that it: offers a useful set of conceptual tools;<sup>13,21</sup> provides a valid way to theorize systems;<sup>12</sup> allows for contextual or specific understanding;<sup>12,22</sup> recognizes processes of emergence and different social levels;<sup>12</sup> and facilitates an understanding of both individual agency and social structure.<sup>12–15,21</sup>

For public health interventions, arguments are made about whether the focus should be on the complexity of the intervention, or the complexity of the social system within which an intervention is implemented.<sup>1</sup> Such arguments are not purely academic. Recent research suggests that when evaluators perceive complexity as residing within the intervention (rather than in the surrounding systems), they consider a more limited role for complexity considerations within evaluation design.<sup>23</sup> The existing UK Medical Research Council guidance on evaluating complex interventions, while providing valuable guidance on evaluation, does not draw explicitly on an understanding of complex social systems.<sup>24</sup> Moreover, the authors have expressed scepticism that the theory of complex systems will prove to be useful, and that there are few examples of successfully completed evaluations drawing explicitly upon complex systems theory to provide guidance for evaluation design.<sup>25</sup>

Experience from other evaluations of community-based public health interventions illustrate the limitations of their design or highlight their discontinuation before they are complete. Nonetheless lessons have been drawn from substantial evaluation attempts. Reflections on the Health Action Zones (HAZ) in the UK, e.g. suggest that policy failure led to their demise, and lack of appropriate planning to ensure comparable data across the HAZ sites led to its evaluation being less useful than it could have been.<sup>26</sup> Another example is New Zealand’s obesity prevention

strategy Healthy Eating Healthy Action (HEHA) which was abruptly ended by an incoming government, and with it the potential for learning from its evaluation.<sup>27</sup> In Australia, Healthy Together Victoria (HTV) and its evaluation suffered a similar fate.<sup>28</sup>

Taking the perspective that public health interventions are located within complex social systems makes explicit some important challenges for the design of their evaluation. First is recognizing that evidence is contextual,<sup>29</sup> meaning factors such as history, resources and other features of the organization of the system need to be considered. A second challenge is the recognition that outcomes or impacts are emergent—resulting from non-linear interactions between systems and the components that make up the system. A third challenge, often articulated as a feature of ‘wicked’ problems<sup>30,31</sup> is that there will be differing perspectives on evaluative judgements that are made, including the criteria that should be applied.<sup>32</sup> To address these challenges, which are exposed by viewing social systems as complex systems, we discuss three important areas which are developing within evaluation theory and we apply them to an evaluation (of Healthy Families NZ) case example described below.

Drawing upon both complexity theory and realist evaluation, Westthorp<sup>33</sup> considers the theory of complex social systems can be used as a base upon which particular intervention theories are layered. This allows for interventions that themselves are not complex, to legitimately call upon theories of complex systems to inform their evaluation, without losing a focus on the theory of the intervention itself. The second development is the evolution of case study methods to research complex social systems, where causation is viewed as complex and contingent, and configurational approaches to causation emphasized.<sup>34–36</sup> Case study methods also allow for context to be integral within the evaluation design, while configuration approaches to causation allow for the interaction of context, process and outcomes—rather than treating these as separate evaluation activities. Finally, the continued development of participatory approaches to evaluation brings to the fore the need to recognize and account for different perspectives within evaluative judgements.<sup>37,38</sup>

Next, the evaluation design of the Healthy Families NZ initiative is outlined as a practical example of a complexity-informed approach to public health evaluation.

## Case example—Healthy Families NZ

Healthy Families NZ is a government-funded initiative which aims to strengthen the prevention system in Aotearoa/New Zealand (Aotearoa/NZ) in order to prevent chronic disease.

It was adapted from Healthy Together Victoria (HTV) in Australia and is focussed on bringing community leadership together to improve people's health where they 'live, learn, work and play'. Informed by systems thinking, the initiative aims to change systems and settings—particularly as they relate to the risk factors of harmful alcohol consumption, tobacco use and inadequate physical activity and nutrition—that influence health. Healthy Families NZ is being carried out in 10 different communities around Aotearoa/NZ. The significant components of the initiative in each community are: investment in a dedicated systems-thinking and acting health promoting workforce; activating local leadership through bringing together partnerships of key organizations and individuals who can influence transformational change; and building on existing action underway in the community to create an integrated, community-wide 'prevention system' for good health. Each Healthy Families NZ location team is housed within an existing local organization or collective. These 'lead providers' comprise local councils, sports trusts and iwi organizations (Iwi, or tribal groups, are traditionally the largest social units in Māori society. Each iwi generally has a recognized territory. Statistics New Zealand describes iwi as 'the focal economic and political unit of the traditional Māori descent and kinship based hierarchy'), selected through a competitive tender process.

The 10 communities involved in the Healthy Families NZ initiative are spread over the length of the country (Fig. 1). Together, the population potentially exposed to the Healthy Families NZ initiative is close to 1 million people. The 10 locations are, in general, in areas with higher than average rates of preventable chronic diseases, higher than average rates of risk factors for these diseases and/or high levels of deprivation. Figure 1 shows the locations and the name of the contracted lead providers (contracts were signed between the Ministry of Health and the lead providers in 2014).

The practical challenges of evaluating Healthy Families NZ related to complexity include that each of the 10 locations are different in many ways (e.g. urban/rural, geographical spread, size of population and history of health promotion initiatives); that there are influences from the wider social/political environment on local activities, practices and policies; and that the main goal of the Healthy Families NZ initiative—to prevent chronic diseases—is a long-term goal, meaning the timeframe expected for change is largely outside the contracted evaluation period (3.5 years).

### The evaluation design

The design of the evaluation is summarized in Fig. 2. Central to the design is the comparative case method which

recognizes that emergent outcomes are the result of 'configurations of causes'<sup>14,34,39</sup> that interact in any direction, and incorporate many elements. The strength of the comparative method case study is in being able to tease out configurations of causes in relation to identified outcomes. Comparison allows these elements and, most crucially, their interactions, to be explored across situations and contexts.<sup>40</sup> Furthermore, building case studies provides a way to group data and information in recognition that there will be relationships between the sources of data, as well as being explicit about setting the boundaries of what is being observed.

The first step in the evaluation, as shown in Fig. 2, is to determine baseline information (first view) through a process of case building. Overall, 10 descriptive case studies representing the 10 Healthy Families NZ locations are being constructed, along with a National perspective case study.

Two years later, descriptive case studies are again developed (second view). Comparison is initially made within locations between the two points in time (first view and second view), followed by comparison across the case studies using Qualitative Comparative Analysis (QCA).<sup>38,39,41,42</sup>

### The case study development

The descriptive case building of first view and second view utilize a number of data sources and collection methods, outlined in Table 1. Appropriate ethics processes have been followed and approvals obtained for the use of these named data sources.

Two important features of the evaluation design are the inclusion of a National perspective case study and also the inclusion of sensemaking processes as a way to incorporate elements of context as well as wider systems influences. The National perspective provides important information on interactions between national-level influences and those at the local level. Several authors, utilizing a complexity frame, have considered the importance of understanding the national/local interaction when evaluating how initiatives have adapted within local settings.<sup>43–45</sup> 'Sensemaking' is where data and findings are taken back to participants and discussed in a structured way to improve interpretation and applicability to local context.<sup>46</sup> A process of sensemaking is being undertaken with each location and with the Ministry of Health (funder) to refine the descriptive case studies; to collaboratively develop indicators (for the QCA described below); and interpret findings.

### Qualitative comparative analysis

QCA enables identification of combinations of factors associated with prioritized outcomes, using formal tools and



**Fig. 1** Healthy Families NZ locations and lead providers.

Source: Massey University Evaluation Team. (2017) Interim Evaluation Report: Healthy Families NZ. Massey University. Wellington.

with a specific conception of cases as complex systems.<sup>40</sup> Each case is considered as a complex combination of properties: a ‘whole’ that should not be lost sight of in the course of analysis. The factors included within the analysis are referred to as ‘conditions’ and the indicators to be developed (discussed below) represent these conditions.

Conditions can include features of case context (e.g. stability of workforce and strength of networks); process (e.g. reach into settings); and outcomes (e.g. changes in health behaviours). QCA identifies combinations of conditions associated with types of outcomes. The assumption is that there are multiple configurations that may lead to similar outcomes; or that divergent outcomes may have similar configurations. The strength of the method is to identify configurations across ‘near neighbour’ cases to inform both initiative design and evaluative judgements of effectiveness.<sup>39</sup> While QCA provides a guide on what configurations are associated with particular outcomes, understanding why relies on going back into the detailed case study and the ‘thick’ qualitative description of cases.<sup>38</sup>

## Development of indicators for QCA

Crisp-set QCA, used here, requires development of dichotomous (either/or) condition indicators. For each condition, criteria against which to make judgements about the dichotomous state of conditions are defined—i.e. whether there is change or not. The timeframe of 2 years between first view and second view case studies, and relatively small population of each Healthy Families NZ location, means that statistical significance is unlikely to be achieved from data measuring any one risk factor or chronic disease indicator. Instead, condition variables are developed that draw upon multiple data sources. Informed by the practice of evaluative rubrics,<sup>47</sup> criteria used to allocate conditions to an either/or condition are a form of evaluative criteria and are developed in consultation with the initiative funder and representatives of the Healthy Families NZ locations.

## Analytic process

QCA has three distinct phases: the production of a data table which shows each case has an outcome and specific combination of conditions; Boolean minimization; and an explanatory analysis that draws upon the full case study, theory and previous research to explain why those particular combinations of conditions (or their absence) contributes to the outcome.<sup>41</sup> As illustrated in Fig. 3 below, the research process with QCA is iterative, usually involving several rounds of within-case analysis and cross-case comparisons where the results inform further within-case analyses. By combining a deep qualitative understanding of the cases, gathered through the case building, identification of causal configurations is possible.

## Discussion

### What is already known

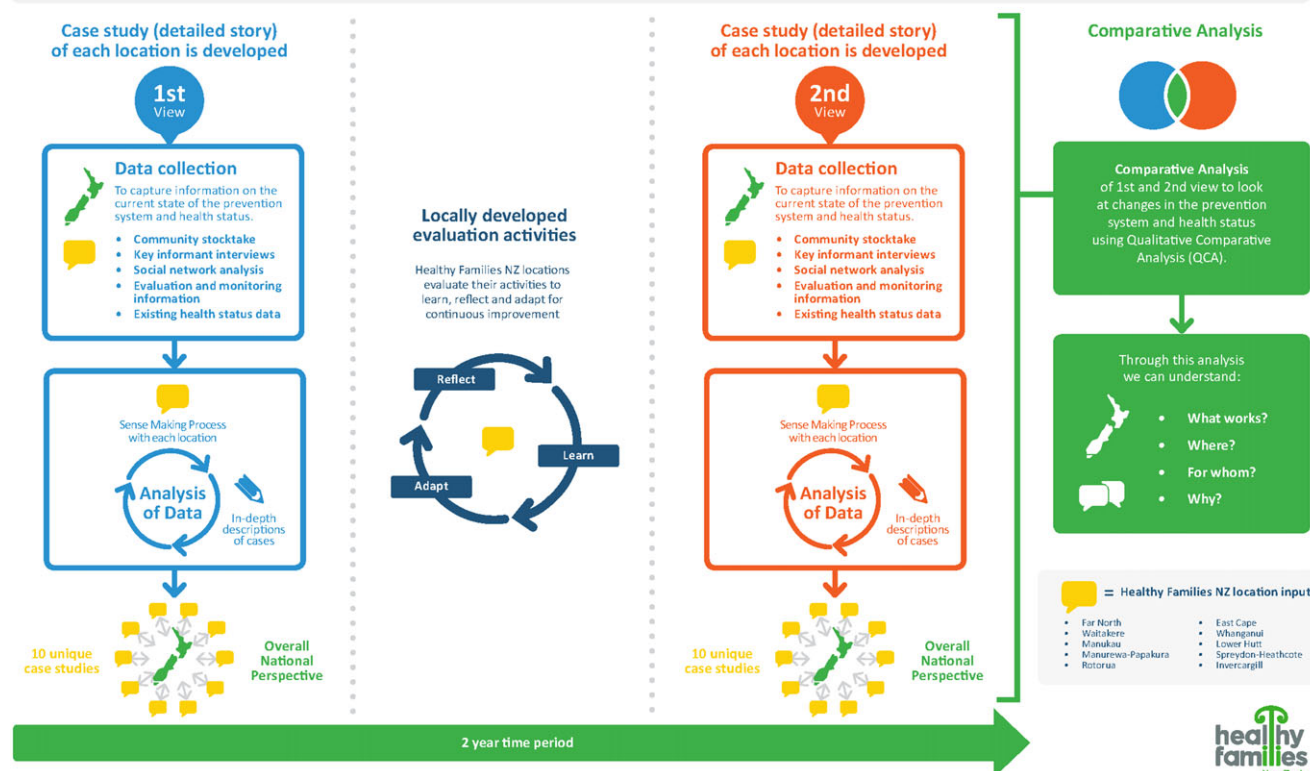
Theories of social complexity challenge the use of evaluation methods that exclude context and process from analysis and interpretation. There are however limited examples of such theories being successfully applied within public health evaluation. This article describes an evaluation of a community-based public health initiative which takes an approach that considers the ‘complexity’ of the social systems in which the intervention is being implemented. Whereas many methods attempt to reduce complexity (e.g. by focussing on individual variables) in order to isolate the ‘parts’ or ‘control’ for context, a complexity frame instead ‘accounts’ for context and acknowledges interdependence.<sup>48</sup> Indeed, there are enduring critiques of the hierarchy of methods for determining whether there are causal



# EVALUATION DESIGN

## Is Healthy Families NZ contributing to better health and wellbeing for the people in our communities?

*Te Tiriti o Waitangi informs the approach to evaluation: He tangata, he tangata, he tangata*



**Fig. 2** Evaluation of Healthy Families NZ—design.

Source: Massey University Evaluation Team. (2017) Interim Evaluation Report: Healthy Families NZ. Massey University. Wellington.

relationships between social variables.<sup>49,50</sup> In a review of impact evaluations, Stern and colleagues conclude that in complex development interventions there is an over-reliance on experimental designs that ask the question ‘did the intervention work?’. They argue that a more appropriate question to ask is ‘did the intervention make a difference?’. This question allows greater room for understanding combinations of causal factors within, and outside, the intervention.<sup>35</sup>

### Strengths and limitations

The case example given in this article provides a practical example of an evaluation design being used for a community-based public health initiative. The methods outlined combine developments in the application of complex systems theories to evaluation. The strengths of the approach are: the ability to explicitly layer complex systems theories with intervention theory; the emphasis on the participation and perspectives of stakeholders; and the gathering of in-depth, context-rich information about each case. The

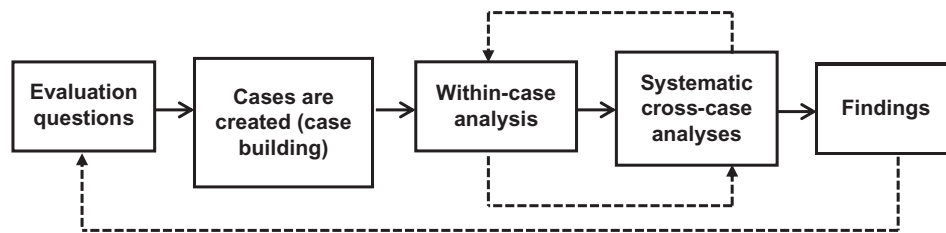
systematic comparison (using QCA) across the cases also allows for some level of generalizability. One limitation is that treating each community as a case study makes it difficult to get quantitative data with sufficient numbers for statistical significance. Instead we are constructing indicators using multiple sources of data to provide indications of direction of change (if any). The time and resource involved in gaining an understanding ‘context’ also has challenges in that it requires the collection of substantial, rich, data while also gathering systematic, comparable data across the case studies. Also required is a significant degree of consistency in research procedures across time as well as an in-depth, iterative relationship with the data.

### What this article adds

This article contributes to the argument that framing social systems as ‘complex’ is useful for shaping the selection of the most appropriate methods for evaluating public health interventions. The practical evaluation case example

**Table 1** Data sources

<i>Data sources</i>	<i>Description summary</i>
Demographic data collection	Data, for selected demographic themes (including population size and structure, ethnicity, household composition, employment, education, deprivation and household economic status), is extracted from the 2013 New Zealand Census for each location to provide a socio-demographic profile. A composite socio-economic indicator—The New Zealand Index of Deprivation (NZDep2013)—extracted at small area (meshblock) level within each Healthy Families NZ location.
Quantitative data	A range of existing quantitative data from survey and routine administrative datasets are used to develop the descriptive case studies and indicators. Key data sources include the New Zealand Health Survey (NZHS) and B4 School Check administrative data.
Community stocktake [provided by location workforce]	Standardized information relating to networks, organizations involved in each local 'prevention system', key community stakeholders/'movers and shakers', number of settings (schools, workplaces, marae, sports clubs, places of worship) and health related programmes within settings, local information and evidence available, health related programmes/projects and initiatives and policies.
Qualitative data	Relevant documents reviewed and analysed to inform the case studies include implementation roadmaps, activities, performance monitoring reports, contracts, policy documents and other support materials. Semi-structured interviews are undertaken with key informants who are pivotal to the implementation of the initiative in each location.
Survey of stakeholders across prevention system	Network structures and change in network can be a contextual variable to aid understanding of factors that contribute to increased capacity, greater collective impact and changes in health behaviour. A web-based survey asks respondents within identified organizations about working relationships between organizations.

**Fig. 3** QCA case process.

provided in this article takes a theoretical position that the social systems, within which an intervention is being implemented, are complex. While using existing methods, the combination of approaches within a frame of social complexity offers an innovative approach to public health evaluation. At the time of writing this article the evaluation of Healthy Families NZ is on-going. There will be further publications detailing both methods and findings to come. This evaluation provides a unique opportunity to operationalize and test the methods described, while extending their more frequent use within other fields to the field of public health.

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relationship, as well as significant input into the evaluation design and data collection methods. We also greatly appreciate the time and effort given to the evaluation from all members of the Healthy Families NZ workforce and other participants across the locations.

## Conflicts of interest statement

The authors declare that they have no competing interests.

## Authors' contributions

AM and MW have contributed equally to this article, they have led the design and implementation of the evaluation and have jointly led the development and writing of this article. RG has contributed to the process and protocols for the case study development. NW has advised on the

evaluation implementation and responsiveness to Maori and the Treaty of Waitangi. KL, MS, CF, BB have contributed to the collection and management of the quantitative data sources and the development of the process and protocols for analysis. All authors read and approved the final manuscript.

## Ethics approval and consent to participate

In line with Massey University processes for ethical conduct of research and evaluation this project was assessed by peer review to be low risk. Consequently, it was not reviewed by one of the University's Human Ethics Committees. The evaluators are responsible for the ethical conduct of the research. Standard ethical processes have been followed.

Approval for the use of named secondary data sources has been obtained from the Ministry of Health.

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