

## **Complexity & Realist Evaluation**

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### **Overview**

1. Complex development interventions and consequences for evaluation
2. Overview of theory-driven evaluation approaches
3. Introduction to Realist Evaluation

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## 1. Complex development interventions and consequences for evaluation

Complexity is in essence about *uncertainty* and confronts us with the problem of *not knowing* what will happen or how it will happen

But, **no panic**, we can (somehow) prepare for uncertainty

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## Complex?

Not all problems or interventions are complex  
(but a lot of them are)

Useful to differentiate between **simple**, **complicated** and **complex**

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### *Simple*, complicated and complex problems

#### **Simple problems**

- have **simple** causes (linear causality)
- have **standard** solutions that can be applied without specific expertise

#### *Example*

- Baking a cake
- Controlling a cholera epidemic

Knowledge and solutions can be formulated into **standard operating procedures**  
**Technical skills** are sufficient

Glouberman S, Zimmerman B. Complicated and complex systems: what would successful reform of Medicare look like?: Commission on the Future of Health Care in Canada; 2002.

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### Simple, *complicated* and complex problems

**Complicated problems** consist of **sets of simple** problems, but cannot be reduced to them

- Compounded by **scale** and **coordination** problems

#### *Example*

- Constructing a high-speed railway across a continent

Solving complicated problems requires **specialised expertise**

- **Formulas** and **instructions** can be developed and are critical to success
- Outcomes can be **predicted**

- Setting up a national vaccination campaign
- Building a hospital

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## Simple, complicated and *complex* problems

### *Complex problems*

- include **sets** of simple and complicated problems to which they are **not reducible**
- **non-linear causal** relations
- are **context**-sensitive

### *Example*

- Raising a child
- Managing decentralisation

To solve complex problems, **expertise** may help, but is not necessarily sufficient for success

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## Simple, complicated and complex problems

**Conflation** of 'complicated' with 'complex' leads to problems

- If solutions fit for complicated problems are applied to complex problems, failure is likely
- Do not apply evaluation and research designs fit for complicated problems to complex ones...

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## 2. Complex (adaptive) systems theory

- Emerged from general systems theory, chaos theory
- Cybernetics (1950s and 1960s) and information theory: some open systems were found to be able to adapt themselves to internal or external changes
- Taken up in management studies since 1990s
- More a 'set of related concepts' than a 'science'

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### Complex adaptive systems

CAS consist of **multiple** elements that are **interconnected**

- Problems with bad banks  
→ crash of banking system in US → global crisis

CAS interact with and are influenced by their **environment**

- Co-evolution

The elements of a CAS can interact in **non-linear** ways

- Non-proportional effects are frequent
  - Small intervention → large effects

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## CAS

- Interactions between the elements show negative & positive **feedback loops**

Bestseller list effect
- **Time delays** in feedback: impact may often show quite late
 

Reduction in tobacco use after decades-long prevention campaigns
- Positive feedback enables a system to **escalate many tiny (incremental) changes** into different behaviour patterns (Stacey 1995)

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## CAS

### Path dependence

CAS are influenced by their evolution in time, which narrows the options for change

= capable of learning and evolving through human interaction (**emergence**)

= not just 'passive' adaptation to environment, but essentially human capacity to learn, adapt and survive

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**As a consequence**

A *complex adaptive system* can only be understood as a whole

- its **elements, relations** and **history** all matter
- evolution **cannot be (fully) predicted**
  - non-linear relations between its elements and environment

but there are some **patterns** to be discovered

- sensitivity to initial conditions & path-dependency constrains the trajectory to some degree

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**Challenges of complexity for researchers & evaluators**

- **Emergence** of unpredictable behaviour & outcomes
- **Causality** is complex
  - non-linear causal relations
  - multiple (synergetic) causal pathways & feedback loops
- Embeddedness in multi-layered contexts and systems (**co-evolution**)
- Difficulties of **attribution**

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### **Consequences of complexity for the evaluation of *development programmes***

Development programmes are about people and dynamic social relations that generate emergent social action -> **complex**

#### **Social, relational or qualitative complexity, a third strand of thinking**

- Relational sociology (Crossley, 2011, Donati, 2011)
- Generalised complexity (Byrne & Callaghan, 2014)
- Realist social theory (Archer, mid 1990s; Bhaskar) – reducing the agency-structure binary logic: causality is always attributed either to structure or to agency

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### **Consequences of complexity for the evaluation of *development programmes***

Two main ways of managing complexity in the evaluation of development programmes (Morin cited in Byrne, 2014)

#### **Restricted complexity**

Reducing complexity: taking the parts apart

- Within epistemological boundaries of positivist paradigm

#### **Generalised complexity**

Trying to comprehend the whole, the synergies between different programme components, influence of relational dynamics, causal mechanisms & emergence

- Challenges positivist paradigm: “why, how and in which conditions?”

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### Different methodological approaches

#### Restricted complexity

Quasi-experimental designs (RCT) in development evaluation (Duflo, MIT Poverty Lab)  
Systems modelling (Trochim et al, 2006)

#### Generalised complexity

Theory driven evaluation  
ToC  
Patton's developmental evaluation  
Realist evaluation

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### Restricted complexity: *Enhanced approaches*

#### Quasi-experimental designs

- Adding **process** evaluation to RCTs
  - E.g. process evaluation to understand uptake of two different systems for insecticide-treated bednets
- Adding **context** analysis to cluster randomized community intervention trials
- Golden standard to assess efficacy and effectiveness but not for assessing the mechanisms of change (why)
  - See e.g. 3ie – International Initiative for Impact Evaluation

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**Restricted complexity:  
*Enhanced approaches***

**Systems modelling**

- Used in attribution of an effect to an intervention
  - E.g. Avahan project: modelling used to test HIV prevalence in case prevention programme would not have been carried out

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**Dealing with social *generalised* complexity**

**Developmental evaluation** (Patton, 2011)

- Focus on complex situations and interventions
- Continuous adaptation of the evaluation design to the evolving intervention (emergent evaluation design)

**Theory-driven approaches**

- Theories of change
- Theory-driven evaluation
- Realist evaluation

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## 2. Overview of theory-driven evaluation approaches

A group of approaches that are driven by **theory** (and **not method**) and that focus on **mechanisms**

### Aim

To learn 'whether an intervention works, for whom, in which contexts and how'

- = essential information for policymakers and programme managers
- Allows appraisal generalisability / transferability of an intervention
  - Different from black box evaluations that only assess whether a programme attained its intended results, not how and in which conditions

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## Theory-driven inquiry

### 3 main schools

- **Theories of change**  
Connell, Kubisch, Schorr & Weiss (1995)
- **Theory-driven evaluation**  
Chen & Rossi (1987)  
aka theory-based evaluation, programme theory evaluation, programme theory-driven evaluation, etc.
- **Realist evaluation (& Realist review and synthesis)**  
Pawson & Tilley (1997)

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## Theory-driven inquiry

### Core element: the programme theory

Prosaic, everyday theories that are concerned with how social problems are generated and programmes function

= beliefs of programme's actors, ≠ grand theories

+

Theories, concepts and knowledge from social science literature

e.g. theory of cognitive dissonance, self-fulfilling prophecy, economic exchange vs social exchange

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## Theory-driven inquiry

**The PT = a testable hypothesis, the basis for testing assumed causal chains**

- **Understanding the contribution** of an **intervention** to the observed **results** through a '**process**' interpretation of causation
  - checking each link between intervention and result
  - if links can be validated by empirical evidence
    - a causal inference can be made
- Identifying and assessing any significant **context factors**
  - that may be needed for the intervention to work
  - that may influence the implementation
  - that may shape the result

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## Theories of change

Developed by the Roundtable on Community Change (Aspen Institute, 1995) to evaluate complex community-based programmes that involve

- many agencies and actors
- several levels and strands of activities
- objectives and strategies that shift in time
- outcomes that are difficult to measure

More pragmatic in approach and oriented towards stimulating practical change

(Connell et al., 1995, Weiss, 1995, Fulbright-Anderson et al., 1998)

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## Theory driven evaluation

- Not methods, but the **problem and existing knowledge** should drive the research and evaluation design
- Starts from the (implicit) assumptions that steers the choice and design of a programme or intervention is useful (“It’s all about the people”)
  - allows to understand what is being implemented and why
  - = the programme theory
- Evaluation = critically assessing the programme theory
  - guided by social science theories and previous evaluations / knowledge on similar development interventions

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### Theory driven evaluation: its usefulness

At the start of the project, **joint reflection** on PT **with the main actors** helps

- in developing a shared understanding of the intervention and of how it would be best implemented
  - Reduces risks of narrow top-down planning
  - Increases ownership and ties in local knowledge
  - Facilitates joint learning
- in assessing the **effectiveness potential** of a new intervention (reality check)
  - Thinking about the mechanisms of change, and review of the evidence
  - “Is this programme really needed? To whose need is it responding?”
- **informing the monitoring & evaluation system**

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## 3. Introduction to Realist Evaluation

### Pawson and Tilley (1997)

In order to be useful for decision makers, evaluations need to indicate

*what works, for whom,  
in what circumstances,  
in what respects,  
over which duration,  
and why?*

rather than respond to ‘does it work?’



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**RE shares** emphasis on the use of **theory** with Theory-driven evaluation and Theories of change

- RE is not method-driven, but theory-driven
  - Driven by a hypothesis
  - Realist evaluation starts with a theory and ends with a (refined) theory
- Theory should in this case be understood as **middle-range theories** (Merton 1968)
 

*“theories that lie between the minor but necessary working hypotheses (...) and the all-inclusive systematic efforts to develop a unified theory that will explain all the observed uniformities of social behavior, social organization and social change”*

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**RE is different** from the other schools of **theory-driven inquiry**

- RE is based on scientific realism
- Specific assumptions about
  - the nature of reality
  - the nature of knowing that reality
  - causation
  - attribution
- Specific approaches to study design, methods and analysis
  - Importance of mechanism, context and actors

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## **Principles of realism**

### **(1) There is a reality independently of the observer**

Realist ontological position

- The material and social world are 'real'
- Anything that has a real effect is real
  - Class, gender, power position, ...
  - Also policies, programmes, interventions, etc. are real
  - ... as well as social structure

Westhorp (2014)

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## **Principles of realism**

### **(2) Knowing reality through science is unavoidably relative to the researcher**

Weak relativist epistemological position

- Developing knowledge on reality
  - is constrained by cognition and is socially constructed
  - remains often incomplete
- But obtaining a better insight in the nature of reality is possible

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## Principles of realism

### (3) All social systems are complex systems

- Programmes are open systems, embedded in and in constant interaction with the (social) systems in which they intervene
  - Choosing the boundaries of the study object may not be easy
  - Context matters
- Programmes are dynamic (while most evaluations are snapshots...)
- Observed outcomes are likely to be multi-determined
- Causality may be non-linear

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## Principles of realism

### (4) Perspective on causation is grounded in 'mechanisms'

*Generative causality* (Pawson & Tilley, 1997)

- **Actors** have a potential for change by their very nature
  - Agency : actors can produce change intentionally (or unintentionally)
- Actors and programmes are rooted in a layered **social reality**
- Result: **interplay** between individuals and institutions, each with their own interests and objectives
- **Causal mechanisms** reside in social relations and wider structural conditions as much as in individuals (structure-agency)

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## Principles of realism

### (4) Perspective on causation is grounded in 'mechanisms'

- Pawson & Tilley: mechanisms = the cognitive, psychological and/or social drivers that influence the reasoning of actors
- Mechanisms are activated when the context conditions are right
  - Ex.: the effect of releasing a tennis ball
    - Different effect in a swimming pool or on the Moon (Westhorp 2014)

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## Example: a pay for performance scheme

### Intervention

Remuneration tied to performance

### Outcome

Increase in performance

### Mechanism

Extrinsic motivation  
*People work harder if you pay them  
 in function of their performance*

### Actors

- Financial incentives work for
- actors with strong extrinsic motivation who aren't paid well
    - a certain time (ceiling effect)

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**Example: a pay for performance scheme**

**Outcomes** are often explained by several mechanisms simultaneously

Intervention works in **specific conditions**

Actions may have **unintended effects**

**Performance:** Intrinsic motivation, working conditions, management style, organisational culture, etc.

\$ incentives → good performance if personnel is also competent, the working conditions are right, etc.

PBF

→ Crowding out of intrinsic motivation

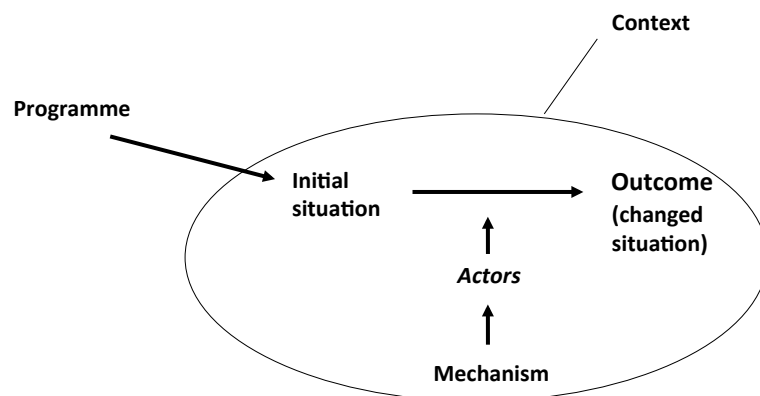
→ Gaming

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**Principles of realism**

(4) **Perspective on causation is grounded in 'mechanisms'**

The CMO heuristic



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## **Principles of realism**

### **Using the CMO configuration as an analytical tool**

CMOs are not tables with lists of mechanisms, lists of context elements and lists of outcomes (Cfr. Pawson & Manzano-Santaella, 2012)

→ CMO *configuration*

At the end of the study, the CMOs are compared with the initial programme theory

Repeated studies lead to accumulation of insights and to a refined PT

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## **Principles of realism**

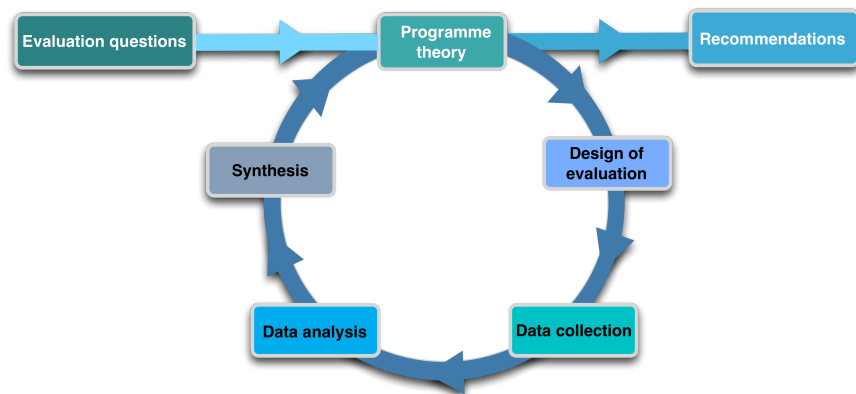
### **(5) Context matters - a lot**

Context conditions

- have an influence on the implementation of the programme
- provide the necessary conditions for the mechanism to be triggered
- may have an effect on the observed outcome

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## Designing a realist evaluation *The RE cycle*



Source: Marchal, et al. 2012

## How does RE view complexity?

### A perspective on causation that is complexity-sensitive

*"Programmes are complex interventions introduced in complex social systems"*  
(Pawson 2013, p. 33)

- Programmes are **open** systems
- Most Community Based Health and First Aid programmes are **embedded** in and in constant **interaction** with the communities and societies in which they intervene
- Programmes are **dynamic**
- Branch managers and volunteers aim at improving CBHFA programmes, not just implement them

### How does RE view complexity?

- Programmes are **social** in nature: people/relations (agency) & structure/culture
- Programmes have **multiple** outcomes
- Volunteers (**people**) are key to success of CBHFA programmes  
Motivation influenced by
  - leadership, management style and organisational culture
  - the social, economic, cultural, ... context
- CBHFA programmes lead to **desired** but perhaps also **undesired outcomes**
  - Result of multiple processes, and intermediate outputs

### A realist's checklist

#### VICTORE - Key characteristics of programme complexity

(Pawson 2013, p. 33)

Volition  
Implementation  
Contexts  
Time  
Outcomes  
Rivalry  
Emergence

## VICTORE

### Volition

Programmes are people – not programmes but people change situations

- Map the actors, their interests and relations, their preferences and choices

### Implementation

Implementation chains are long and reiterative, in constant adaptation

- Map the implementation chains
  - actually implemented activities (intensity, duration),
  - actors actually involved
  - intermediate outputs and outcomes
  - underlying processes

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## VICTORE

### Contexts

- **Proximal** context  
Individuals, interpersonal relations, organisations
- **Distal** context  
Social/political/cultural/economical/ecological environment
  - Map layers of the context in function of the key programme processes

### Time

Intervention history and timing are important (**path dependence**)

- Map the implementation history, previous experience of actors with similar programmes, key events/decisions

VICTORE

**Outcomes**

Multiple outcomes, contested interpretations, attribution problems

*Success = different things for different people*

- Map outcomes by talking to all stakeholders - identify contestation

**Rivalry**

Influence of other programmes

- Map **other programmes** and events that may have shaped the outcomes
- Seek to establish **contribution** – not *attribution*

VICTORE

**Emergence**

Not all actual outcomes are planned

- Search for intended but also unintended outcomes, and both positive and negative effects



## Conclusion

### When to do a RE?

Useful when learning is a must and/or situations of uncertainty

- Systematically building upon existing knowledge  
(see eliciting the initial PT)
- Empirical research
  - causal web, differentiating planned and actual intervention, planned and actual outcome, underlying mechanism and essential context factors
- The programme theory as a bridge between cases
  - Helpful in expanding external validity

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## Conclusion

### When to do a RE?

CAUTION: RE can be time-consuming...

... but is very rewarding

- Increased context adaptation and use of local knowledge
- Framing of programme in existing knowledge allows for systematic learning  
Initial PT - contextualisation – decontextualisation – refined PT

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## Further information and support

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**Better Evaluation**

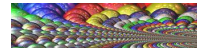
[betterevaluation.org/approach/realist\\_evaluation](http://betterevaluation.org/approach/realist_evaluation)



Menu

Realist Evaluation

Realist evaluation is a form of theory-driven evaluation, but is set apart by its explicit philosophical underpinnings.



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