# Model Ensembles for Natural Resource Management: Extensions of Qualitative Differential Equations Using Graph Theory and Viability Theory

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For Gerhard

## Preface

### Anecdote Concerning the Lowering of Productivity

A fisherman is dozing in the sun in his rowing boat. A tourist asks: "The weather is great and there's plenty of fish, so why are you lying around instead of catching more?"

The fisherman replies: "Because I caught enough this morning."

"But just imagine," the tourist says, "you could go out three or four times a day and bring home three or four times as much fish! And then you know what could happen?" – The fisherman shakes his head.

"After a year you could buy yourself a motorboat, and after two years a second one. One day you might be able to build a freezing plant." – "And then?" asks the fisherman.

"Then you could spend your time at the harbour, dozing in the sun and looking at the beautiful ocean."

"But that is exactly what I am already doing," says the fisherman. (based on Böll 1986)

This work is motivated by concerns about the way our society interacts with its natural environment. The story about the fisherman illustrates how social processes shape the state of natural resources. I'm convinced that mathematical methods can help designing sustainable futures – if they are used with a respectful attitude towards other domains of knowledge. I hope my work contributes to this task.

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> Klaus Eisenack Potsdam, September 2005

## Contents

No	Notations and Concepts 9				
1	Intro	oduction	11		
2	Qua	litative Reasoning with Model Ensembles	17		
	2.1	Model Ensembles and Set-Valued Solution Operators	17		
	2.2	Qualitative Differential Equations			
	2.3	Differential Inclusions	42		
	2.4	Viability Theory	45		
3	Abstraction and Restriction Techniques		51		
	3.1	No-Return Abstraction	52		
	3.2	Marginal Edges			
	3.3	Ordinal Assumptions	68		
	3.4	Quantitative Bounds	77		
4	Management of Natural Resources				
	4.1	Land-Use Changes in Developing Countries	87		
	4.2	Capital Accumulation in Unregulated Fisheries	95		
	4.3	Participatory Fishery Management	101		
	4.4	Lake Management	116		
5	Con	Conclusions 12			
M	odel (	Code	135		
Re	References				
Le	Lebenslauf				
Zu	samn	nenfassung	153		

# **Notations and Concepts**

$\mathbb{R},\mathbb{R}_+,\mathbb{R}$	real numbers, non-negative and non-positive real numbers natural numbers (including 0)
$X \subseteq \mathbb{R}^n$	state space
$C(X,Y), C^1(X,Y)$	space of continuous and
	continuously differentiable functions from $X$ to $Y$
$x(\cdot),(x_i)$	trajectory or solution on $\mathbb{R}_+$ , sequence
$\dot{x}(\cdot) = \frac{d}{dt}x(\cdot)$	derivative with respect to time
$\dot{x}(\cdot) = \frac{d}{dt}x(\cdot)$ $D_x f = \frac{\partial f}{\partial x}, D_j f_i = \frac{\partial f_i}{\partial x_i}$	partial derivatives
$\mathcal{J}(f), \mathcal{P}(X)$	Jacobian of a function $f$ , power set of a set $X$
$D^c$	complement of a set $D$
$egin{array}{lll} \langle x_1, x_2, \dots, x_n  angle \ (x_1 \ x_2 \ \dots \ x_n)^t \end{array}$	ordered set
$(x_1 x_2 \ \dots \ x_n)^t$	transpose of a vector

### **Model Ensembles**

$\mathcal{M}$	model ensemble
ε	space of admissible trajectories
$\mathcal{M}(\Sigma)$	monotonic ensemble (DEF. 1, p. 22)
$\mathcal{M}(\mu,C)$	monotonic landmark ensemble (DEF. 4, p. 29)
$\mathcal{S}_{\mathcal{M}}(\cdot)$	set-valued solution operator

### **Qualitative Differential Equations**

${\cal A}$ , ${\cal A}_{*}$	domain of signs and of extended signs [-], 0, [+], [?]
$\sigma, \sigma_i, \sigma_{i,j}$	(extended) sign
$[\cdot], [\cdot]_{\lambda}$	sign operators, extended to vectors and matrices (p. 22, 28)
$\approx$	consistency of signs, sign vectors or sign matrices (p. 22)
$\Sigma$	matrix of extended signs
v,w	sign vectors, qualitative states or vertices of a state-transition-graph
$\tilde{x}$	(landmark) abstraction of a reasonable function $x(\cdot)$ (DEF. 2, p. 23, DEF. 5, p. 29)
${\mathcal S}_{{\mathcal M}(\Sigma)}(\cdot)$	solution operator of a monotonic ensemble (p. 22)
${\mathcal S}_{{\mathcal M}(\Sigma)}(\cdot)\ \lambda, \Lambda$	landmark, landmark vector (p. 28)
Q,S	quantity space, qualitative state space (p. 28)
$\operatorname{qmag}(v), \operatorname{qdir}(v), \operatorname{qval}_i(v)$	) qualitative magnitude, qualitative direction, qualitative value of
	a qualitative state v (Eq. 2.8, Eq. 2.10, Eq. 2.6, p. 28)
${\mathcal S}_{{\mathcal M}(\mu,C)}(\cdot)$	solution operator of a monotonic landmark ensemble (p. 29)
$\mu$	map from a quantity space $Q \to \mathcal{A}^{n \times n}_*$
$C = \{C_1, \dots, C_m\}$	set of constraints on a qualitative state space
$a_\Lambda(x,\dot{x})$	state abstraction with respect to a landmark vector $\Lambda$ (p. 28)
$Z_0(v)$	vanishing indices of a sign vector $v$ (p. 24)
$v \wedge w$	intermediate state of qualitative states $v, w$ (p. 25, 30)
$\pi_I(G)$	simple projection of a state-transition graph $G$
	with respect to an index set I (DEF. 11, p. 39)

#### **Differential Inclusions and Viability Theory**

$F: X \rightsquigarrow Y$	set-valued map from X to the power set $\mathcal{P}(Y)$ (p. 42)
$\operatorname{Dom}(F), \operatorname{Graph}(F)$	domain and graph of a set-valued map $F$ (p. 42)
${\mathcal S}_F(\cdot)$	solution operator of a differential inclusion given
	by a set-valued map $F$ (p. 43)
$\operatorname{Viab}_F(K,C)$	viability kernel of $K$ with target $C$ (under a
	set-valued map $F$ , DEF. 13, p. 46)
$\operatorname{Inv}_F(K,C), \operatorname{Abs}_F(K,C)$	, invariance kernel, absorption basin and
$\operatorname{Capt}_F(K,C)$	capture basin of $K$ with target $C$ (DEF. 13, p. 46)

#### **Graph Theory**

G	directed graph
V(G), E(G)	set of vertices and edges of a graph $G$
v,w and $e,f$	vertices and edges
$v_1, \ldots, v_m$	path in a graph
$\Gamma(v), \Gamma^*(v)$	successors of vertex $v$ in $G$ and in its transitive closure $G^*$
$G^{*}, G^{-1}$	transitive closure, reversal of a graph $G$
$G^-$	bi-directed subgraph of $G$ (p. 38)

For a directed graph G with vertices V(G),  $E(G) \subseteq V(G) \times V(G)$  is the set of edges. Since we deal only with undirected graphs, we simply call them graphs. For an edge e = (v, w), v is called the **source** of e, and w its **target**. The set of **successors** of a state  $v \in V(G)$  is denoted by  $\Gamma(v) := \{w \in V(G) \mid (v, w) \in E(G)\}$ . The number  $|\Gamma(v)|$  is the **degree** of the vertex v. A graph G is **loop free** if  $\forall v \in V(G) : (v, v) \notin E(G)$ . A finite sequence of vertices in V(G), written  $v_1, \ldots, v_m$ , is called a **path** of length (m - 1) if  $\forall i = 1, \ldots, m - 1 :$  $v_{i+1} \in \Gamma(v_i)$ , and no state occurs more than once in the sequence. The only exception to the last restriction is if  $v_m = v_1$ , when the path is called a cycle. The restriction to finite sequences is sufficient for this thesis. The **transitive closure**  $G^*$  of G is defined by  $V(G^*) := V(G)$  and

$$E(G^*) := \{(v, w) \in V(G) \times V(G) \mid \text{ there is a path } v, \dots, w \text{ in } G\}$$

A graph H with  $V(H) \subseteq V(G)$  and  $E(H) \subseteq E(G)$  is a **subgraph** of the **supergraph** G. A graph H is induced by a subgraph H' of G if V(H) = V(H') and

$$E(H) = \{ (v, w) \in E(G) \mid v, w \in V(H') \}.$$

A subgraph H of G is **strongly connected**, if for all  $v, w \in V(H)$ ,  $v \neq w$ , there is a path  $v, \ldots, w$  and a path  $w, \ldots, v$ . It is called a **strongly connected component** if it is a maximal strongly connected subgraph with respect to inclusion of vertices. For two graphs G, H, the **intersection**  $G \cap H$  is defined by  $V(G \cap H) = V(G) \cap V(H)$ ,  $E(G \cap H) = E(G) \cap E(H)$  and the **union**  $G \cup H$  by  $V(G \cup H) = V(G) \cup V(H)$ ,  $E(G \cup H) = E(G) \cup E(H)$ . For an edge  $(v, w) \in E(G)$ , its reversal is  $(w, v) \in V(G) \times V(G)$ . The **reversal**  $G^{-1}$  of G is obtained by reversing all edges, i.e.  $V(G^{-1}) := V(G)$ ,

$$E(G^{-1}) := \{ (v, w) \in V(G) \times V(G) \mid (w, v) \in E(G) \}.$$

An edge  $e \in E(G)$  is **bi-directed** if E(G) also contains its reversal.