



- Principles of Lindenmayer Systems
- **3** Extensions of Lindenmayer Systems



Context of Our Research

Work not quite in progress...

- Lindenmayer Systems
 - as example of behavioral environmental modelling in a lecture (2010, Bayreuth)
 - as running example for an invited tutorial on categories, algebra and coalgebra (2011 Workshop Young Modellers in Ecology, Wallenfels, DE)
- Context-free Grammars, Coalgebraically (2011 CALCO, Winchester, UK)
- How are the two related? (2011 CALCO Coffee Break)

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 - to state-of-the-art photorealistic image synthesis



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Philosophy of Lindenmayer Systems

Growth is... Replacement of building blocks by more building blocks Decentral with local rules of replacement Discrete with steps of simultaneous growth, proceeding from one global stage to the next Creation of form by establishing neighbourship between blocks, in the simplest case linear



Lindenmayer Systems in Literature

The standard reference is **The Algorithmic Beauty of Plants** (Prusinkiewicz and Lindenmayer 1990, free high-quality PDF edition avaliable).

See also http://algorithmicbotany.org/.





2 Principles of Lindenmayer Systems

3 Extensions of Lindenmayer Systems



Classical Definition (Syntactic)

- A deterministic context-free L-System is a triple (V, ω, P) with
 - V a finite set
 - $\omega \in V^+$ an axiom
 - $P \subseteq V \times V^*$ a functional *rewrite* relation
- A derivation step of (V, ω, P) replaces each symbol v_i in a word v₁ · · · v_n ∈ V* simultaneously by the subword w_i such that (v_i, w_i) ∈ P.
- The derivation sequence of (V, ω, P) is the infinite sequence of steps starting from ω.

Comparison to Grammars

- Parallel instead of serial rewriting
- No final state: the journey is the reward

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- *P* is the graph of a function $p: V \rightarrow V^* = \mathcal{L}V$
 - trivial pairs (v, v) are omitted in writing
- Unpointed L-Systems are coalgebras (V,p) of the list functor $\mathcal L$
- Derivation steps apply p elementwise,
- and forget boundaries between subwords

- L-Systems are essentially list coalgebras.
- L-System derivation is Kleisli extension in the list monad.

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Introduction

Principles of Lindenmayer Systems

3 Extensions of Lindenmayer Systems

Outlook

General Idea

Define L-System extension *components* as monadic functors, to be composed (left or right) with \mathcal{L} .

Composite Monads

Bad News Two monadic functors S, T do not generally give rise to a monad for ST.

General Idea

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Composite Monads

Bad News Two monadic functors S, T do not generally give rise to a monad for ST.

Good News A distributive law of T over S does the job. $\lambda: TS \Rightarrow ST \quad \eta^{ST} = \eta^{S}\eta^{T}$

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Even More Composite Monads

What about multiple extensions?

- Fix order of nesting
- For a finite sequence of monads S_1, \ldots, S_n
 - find a "triangular matrix" of distributive laws

$$\lambda^{ij} : S_j S_i \Rightarrow S_i S_j$$
 for all $i < j$

- giving rise to compositions in any order of parentheses
- which are all equivalent \implies monad composition is associative

Examples of Extensions

Ordinary	A ightarrow	AB E	$B \to A$
+Terminals	$F \rightarrow F + FF + F$		
+Nondeterminism	A ightarrow AB	A ightarrow BA	$A \qquad B \to A$
+Probabilism	$A \stackrel{1/3}{ ightarrow} AB$	$A \stackrel{2/3}{ ightarrow} BA$	$A \qquad B \stackrel{1}{\to} A$
+Parameters	$I(t) \stackrel{t>0}{ ightarrow} I(t)$	(t - 1)	$I(t) \stackrel{t=0}{ ightarrow} S$

Terminals

Coproduct (Error) Monad

$$\mathcal{C}_{\mathcal{A}} = (-) + \mathcal{A}$$
 $\eta^{\mathcal{C}_{\mathcal{A}}} = \iota_1$ $\mu^{\mathcal{C}_{\mathcal{A}}} = [\mathsf{id}, \iota_2]$

- Fixed as innermost extension (right of \mathcal{L})
- Universal distributive law over any monad: $[S\iota_1, \eta^S \circ \iota_2] : C_A S \Rightarrow SC_A$

Nondeterminism

Finite Power Monad

$$\mathcal{P}_{f}X = \{Y \subseteq X \mid Y \text{ finite}\} \quad \mathcal{P}_{f}h(Y) = \{f(y) \mid y \in Y\}$$

$$\eta^{\mathcal{P}_{\mathsf{f}}}(x) = \{x\} \quad \mu^{\mathcal{P}_{\mathsf{f}}} = \bigcup$$

- Fixed as outer extension (left of \mathcal{L})
- Distributive law: Cartesian product $\prod : \mathcal{LP}_{f} \Rightarrow \mathcal{P}_{f}\mathcal{L}$

Probabilism

Finitely Supported Distribution Monad $\mathcal{D}_{f}X = \{p : Y \to [0,1] \mid Y \in \mathcal{P}_{f}X; \sum_{x} p(x) = 1\}$ $\mathcal{D}_{f}h(p)(y) = \sum_{x} p(x) \,\delta_{h(x),y}$ $\eta^{\mathcal{D}_{f}}(x)(y) = \delta_{x,y} \qquad \mu^{\mathcal{D}_{f}}(p)(y) = \sum_{q,x} p(q) \,q(x) \,\delta_{x,y}$ • Fixed as outer extension (alternative to \mathcal{P}_{f})

• Distributive law: independent product

$$\psi: \mathcal{LD}_{f} \Rightarrow \mathcal{D}_{f}\mathcal{L}$$

$$\psi(p_{1}\cdots p_{n})(y_{1}\cdots y_{n}) = \sum_{x_{1}\cdots x_{n}} p_{1}(x_{1})\cdots p_{n}(x_{n}) \,\delta_{x_{1},y_{1}}\cdots \delta_{x_{n},y_{n}}$$

 No mention of stochastic independence in (Prusinkiewicz and Lindenmayer 1990)!

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 $a/v \cdot C \mathcal{D}_{a} \rightarrow \mathcal{D}_{a} C$

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Parameters

Classical Definition (Syntactic)

- ad-hoc datatypes and expression language
- formal parameters, guards, actual parameters
- long-winded informal description of evaluation

Coproduct-structured Carrier

For each symbol $v \in V$ fix a parameter space A_v

$$V' = \coprod_{v} A_{v}$$

- Parametrized L-Systems as coalgebras (V', p)
- Parameter spaces may be infinite
 - restore "essential finiteness" by requiring a homomorphism to a finite coalgebra (W, q), respecting coproduct structure
 - optionally rule out guards by requiring $W \cong V$

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Outlook

- Lindenmayer Systems vs. grammars and languages
 - build on existing work

Trace Semantics (Hasuo and Jacobs 2005) Weighted Automata (Honkala 2009) BDEs, RegExps (Winter, Bonsangue, and Rutten 2011)

- Final coalgebras, bisimulations
 - relationship to fractals
 - "botanic equivalence", turtle graphics equivalence
- Context-sensitive Lindenmayer Systems
 - possibly bialgebraic?
 - analogous to cellular automata (Trancón y Widemann and Hauhs 2011)
- Lindenmayer Systems as Model Coalgebras
 - explore didactic potential
 - contributions welcome! wiki?

Take-Home Messages

- Lindenmayer Systems are, in their basic form, finite coalgebras of the list monad
- Dynamics by iteration in the Kleisli category
- Extensions interact with the basics by monadic distributive laws
- Further coalgebraic notions likely to be applicable
- Nice intuitive demonstration of coalgebra for non-experts

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