

# Spreadsheet drawings of plant branching from modified Lindenmayer grammars

John Banks

The University of Melbourne



October 9, 2015

# The Context

**MAT1MAB** Mathematical Applications in Biology (La Trobe University):

- ▶ **No calculus** assumed or taught.
- ▶ Organised around application focussed themes (Learning Modules).
- ▶ Uses spreadsheets to run simulations/models (this made the biologists happy).
- ▶ No lectures. Two 1 hour practice classes per week.

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- ▶ No lectures. Two 1 hour practice classes per week.
- ▶ **Objectives(?)**:
  - ▶ Give the flavour of some accessible models.
  - ▶ Teach spreadsheet skills.
  - ▶ Surreptitiously improve quantitative/algebraic skills.

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► Six two week **Learning Modules**:

1. **Growth and Scaling**:

Size matters and matters of size.

2. **Epidemics**: Enough to make you sick!

3. **Cellular Automata**:

What do epidemics and bushfires have in common?

4. **Population Models**: When time runs smoothly.

5. **Growth Creates Form**: The shape of things organic.

6. **Climate Models**: Taking Earth's temperature.

# The Content

► Six two week **Learning Modules**:

1. **Growth and Scaling:**

Size matters and matters of size.

**Real agenda:** Revise basic functions.



2. **Epidemics:** Enough to make you sick!

3. **Cellular Automata:**

What do epidemics and bushfires have in common?

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# The Content

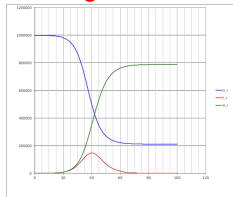
► Six two week **Learning Modules**:

1. **Growth and Scaling:**

Size matters and matters of size.

2. **Epidemics:** Enough to make you sick!

**Real agenda:** Intro to difference equations



3. **Cellular Automata:**

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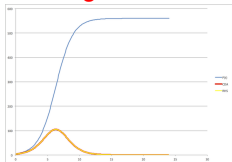
2. **Epidemics:** Enough to make you sick!

3. **Cellular Automata:**

What do epidemics and bushfires have in common?

4. **Population Models:** When time runs smoothly.

**Real agenda:** Differential equations (by stealth).



5. **Growth Creates Form:** The shape of things organic.

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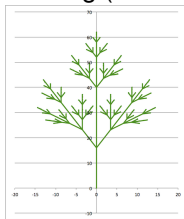
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**Real agenda:** Motivate trig functions and algorithmic thinking (and have fun!)



6. **Climate Models:** Taking Earth's temperature.

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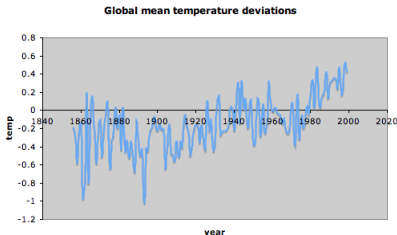
What do epidemics and bushfires have in common?

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**Real agenda**: Intro to stochastic processes.



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# The Grammars

- ▶ **Lindenmayer Grammars** can be used to model various geometric and biological phenomena.
- ▶ Motivating application of branching in annual plants is a nice example of a mathematical model in biology.
- ▶ A (context free) Lindenmayer Grammar specifies the branching rules for a plant.

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- ▶ **Derivations** from this grammar generate an abstract **instruction strings**  $w_1, w_2, w_3, \dots$ .
- ▶ Each  $w_i$  describes the branching structure at a particular stage of growth.

# The Example

- ▶ **Alphabet:**  $X, F, [, ], +, -$ .
- ▶ **Start word:**  $w_0 = X$ .
- ▶ **Rules:**

$r_0 : X \rightarrow F[+X][-X]FX$  (Replace all  $X$ 's by  $F[+X][-X]FX$ )

$r_1 : F \rightarrow FF$  (Replace all  $F$ 's by  $FF$ )

- ▶ No rules for  $[, ], +, -$ , so leave them alone.
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- ▶ Prohibitive to compute realistic strings by hand.

# The Turtle Graphics Approach

- ▶ The **Turtle** is a drawing robot that sequentially interprets instruction string symbols in various ways:
  1. Moving forward (not important for us).
  2. Drawing a line segment as it moves forward.
  3. Turning (left or right) through a fixed angle.

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- ▶ Spreadsheets enable students to plot satisfying diagrams of branching structures.

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  1. Moving forward (not important for us).
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  3. Turning (left or right) through a fixed angle.
- ▶ And for branching structures:
  4. Remembering its current position (**push**).
  5. Returning to its most recently remembered position and then forgetting it (**pop**).
- ▶ Prohibitive to plot realistic examples by hand.
- ▶ Small examples done by hand in practice classes to give insight into the process.
- ▶ Spreadsheets enable students to plot satisfying diagrams of branching structures.
- ▶ **Problem!** Interpretations 4 and 5 require the use of a **stack** – difficult to implement in a spreadsheet.



# The Turtle's World View

- ▶ At each time  $t$ , the turtle is at some location  $(x, y)$  and is pointing in direction  $\alpha^\circ$ .
- ▶ It has a fixed turn angle  $\delta^\circ$  and a movement unit  $d$ .

# The Turtle's World View

- ▶ At each time  $t$ , the turtle is at some location  $(x, y)$  and is pointing in direction  $\alpha^\circ$ .
- ▶ It has a fixed turn angle  $\delta^\circ$  and a movement unit  $d$ .
- ▶ Instructions it understands:

Symbol	Interpretation	State Changes
$F$	move forward by $d$ drawing a line	$x_{\text{new}} = x + d \cos(\alpha^\circ)$ , $y_{\text{new}} = y + d \sin(\alpha^\circ)$
$f$	move forward by $d$ without drawing a line	$x_{\text{new}} = x + d \cos(\alpha^\circ)$ , $y_{\text{new}} = y + d \sin(\alpha^\circ)$
$+$	turn left by $\delta^\circ$	$\alpha_{\text{new}}^\circ = (\alpha + \delta)^\circ$
$-$	turn right by $\delta^\circ$	$\alpha_{\text{new}}^\circ = (\alpha - \delta)^\circ$
$[$	save current state	None
$]$	return to state saved at <i>previous</i> $[$	Revert
Other	Ignore	None

# “Node rewrite” examples

Both  $n = 5$ .

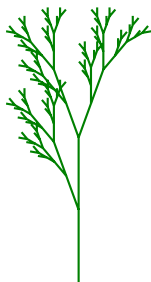


$$\delta = 25^\circ$$

$$w_0 = X$$

$$r_0 : X \rightarrow F[+X][-X]FX$$

$$r_1 : F \rightarrow FF$$



$$\delta = 20^\circ$$

$$w_0 = X$$

$$r_0 : X \rightarrow F[+X]F[-X] + X$$

$$r_1 : F \rightarrow FF$$

# The Marvel of Growth

$$\delta = 25^\circ$$

$$w_0 = X$$

$$r_0 : X \rightarrow F[+X][-X]FX$$

$$r_1 : F \rightarrow FF$$

$$n = 1$$

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$$\delta = 25^\circ$$

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$$r_1 : F \rightarrow FF$$

  
 $n = 1$

  
 $n = 2$

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$$r_0 : X \rightarrow F[+X][-X]FX$$

$$r_1 : F \rightarrow FF$$

$n = 1$



$n = 2$



$n = 3$



# The Marvel of Growth

$$\delta = 25^\circ$$

$$w_0 = X$$

$$r_0 : X \rightarrow F[+X][-X]FX$$

$$r_1 : F \rightarrow FF$$

$n = 1$



$n = 2$



$n = 3$



$n = 4$



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$$\delta = 25^\circ$$

$$w_0 = X$$

$$r_0 : X \rightarrow F[+X][-X]FX$$

$$r_1 : F \rightarrow FF$$

$n = 1$

$n = 2$

$n = 3$

$n = 4$

$n = 5$



# The Stack Bypassed

- ▶ We can sometimes avoid stacks using a modified Lindenmayer Grammar.
- ▶ The idea is to “retrace steps” back to the state where a [ would have pushed the state.

# The Stack Bypassed

- ▶ We can sometimes avoid stacks using a modified Lindenmayer Grammar.
- ▶ The idea is to “retrace steps” back to the state where a `[` would have pushed the state.
- ▶ To do this we introduce a new turtle instruction  $R$  meaning draw (move?) in reverse:

Symbol	Interpretation	State Changes
$R$	move backward drawing a line	$x_{\text{new}} = x + d \cos((180 + \alpha)^\circ)$ $y_{\text{new}} = y + d \sin((180 + \alpha)^\circ)$



# Modifying the Example

- ▶ **Alphabet:**  $R, X, F, [, ], +, -$ .
- ▶ **Start word:**  $w_0 = X$ .
- ▶ **Production Rules:**

$$r_0 : X \rightarrow F + X - -X + FXRR$$

$$r_1 : F \rightarrow FF$$

$$r_2 : R \rightarrow RR$$

(No rules for  $[, ], +, -$ , so leave them alone.)

- ▶ **Example Derivation:**  
 $w_0 = X$

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$$w_0 = X$$

$$w_1 = F + X - -X + FXRR$$

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$$w_0 = X$$

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$$w_2 = FF + F + X - -X + FXRR - -F + X - -X + FXRR + FFF$$

# Modifying the Example

- ▶ **Alphabet:**  $R, X, F, [, ], +, -$ .
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$$w_0 = X$$

$$w_1 = F + X - -X + FXRR$$

$$w_2 = FF + F + X - -X + FXRR - -F + X - -X + FXRR + FFF$$

$$w_3 = \text{Ridiculously Long String!}$$

- ▶ **It works!**

# The Question ...

- ▶ This modified grammar approach raises an interesting mathematical problem:

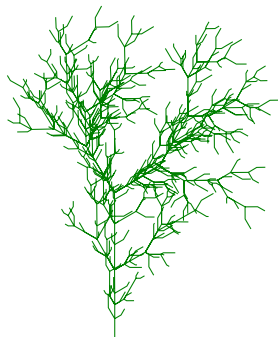
## Question

Given an arbitrary Lindenmayer system, can we always find a modified grammar that generates the same diagrams?

If not, for what class of systems is this possible?

# An “edge rewrite” system

- ▶ Not clear that modified grammar can always be found for “edge rewrite” systems. EG:





$$\delta = 30^\circ$$

$$w_0 = F$$

$$r_0 : F \rightarrow FF - [-F + F] + [+F - F]$$



# References

-  Aristid Lindenmayer, *Mathematical models for cellular interaction in development.*, J. Theoret. Biology, **18** 280-315, 1968.
-  Przemyslaw Prusinkiewicz, *The Algorithmic Beauty of Plants* 1990,  
available online at: <http://algorithmicbotany.org/>

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