PFE 11

Palubicki

Computer simulations of biological patterns



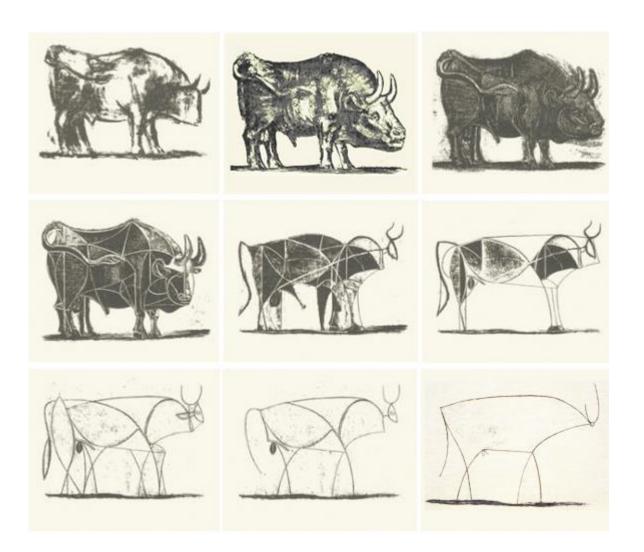
Synthetic tree

Real tree

Simulation of Biological Patterns

- Simulation is the operation of a mathematical model in time
- **Biological Model**: a simplified description of a biological pattern

Models of Biological Patterns



"Bull", Picasso

Models of Biological Patterns

 Computer models use formal descriptions of biological pattern formation with the help of mathematics and programming languages

> I have deeply regretted that I did not proceed far enough at least to understand something of the great leading principles of mathematics; for men thus endowed seem to have an extra sense.

- Charles Darwin

Growth of a mango tree



Grechi et al., VPlants team, CIRAD, Montpellier

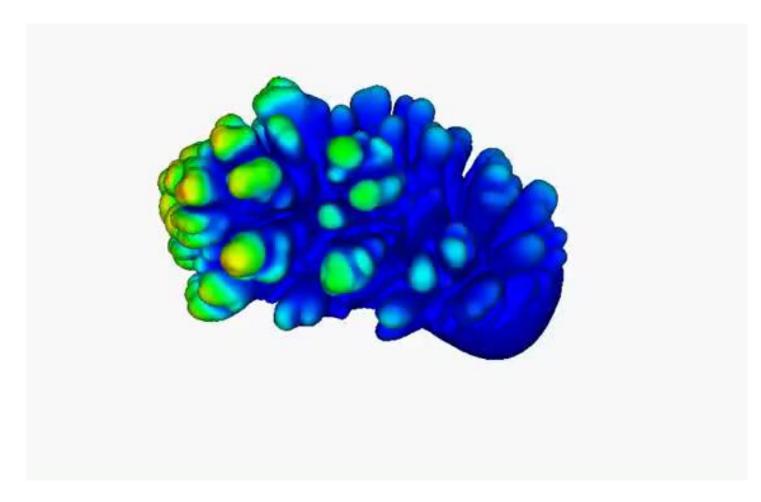
Fungi development

Diffusion Limited Aggregation

with a Cellular Automaton Machine

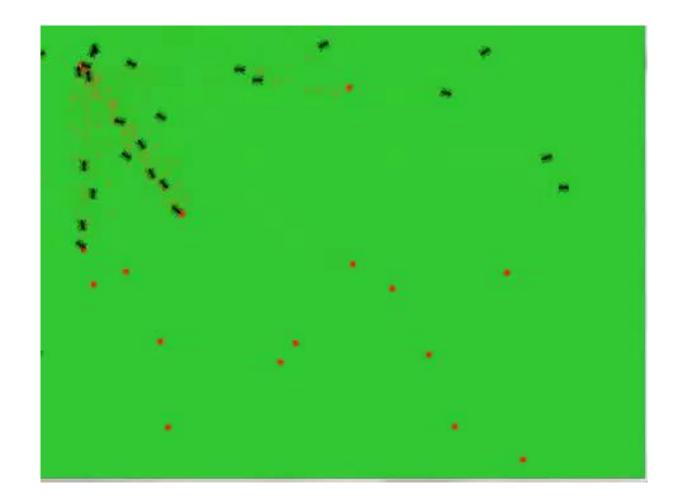
by Rozan Martin

Coral growth



Chindapol et al. 2013

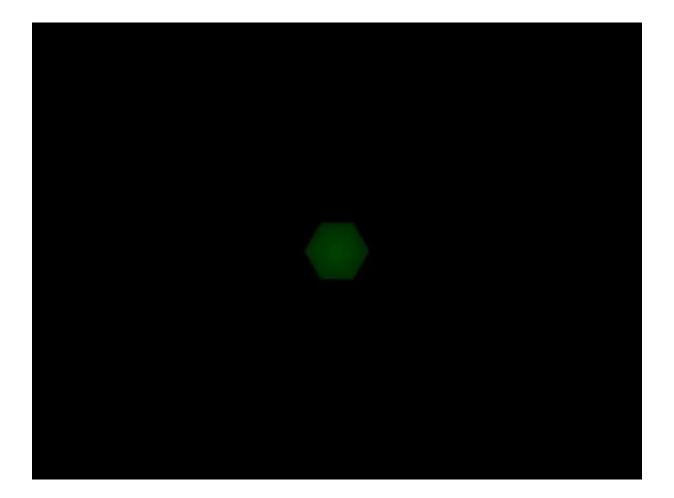
Ant trails



Bird flocking



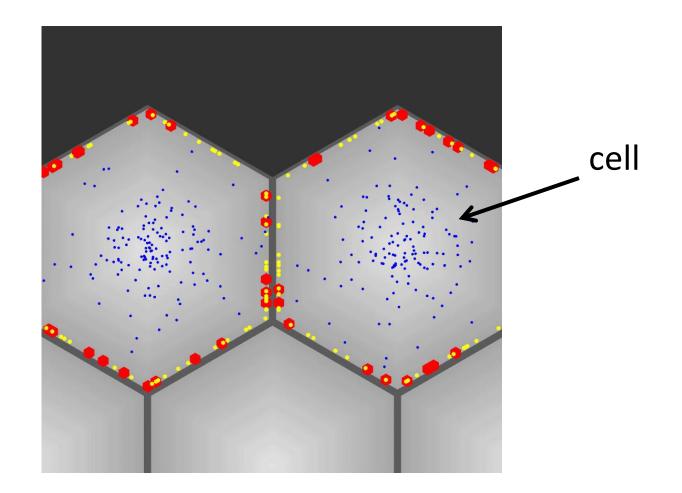
Plant Phyllotaxy



Smith et al. 2006

Protein transport in cells

- Auxin in cytoplasm
- Auxin in apoplast
- Efflux transporter
- Influx transporter



Protein folding



https://www.youtube.com/watch?v=iaHHgEoa2c8

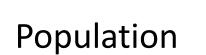
Physical simulations

Interactive Wood Combustion of Botancial Tree Models

Online Submission ID: 0217



Modeling Scales



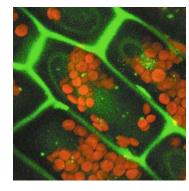
Organism



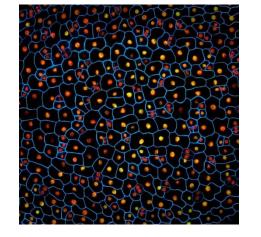
Organ

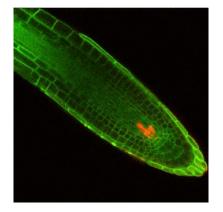
Tissue

Cell









Why Modeling?

- Visualization of concepts
- Communication of ideas
- Validation of hypotheses
- Generation of new hypotheses
- Predicting the future
- Artistic tools
- •

Different Modeling Methods

Vertex models

Formal grammars

Particle models

Cellular automata

Boolean nets

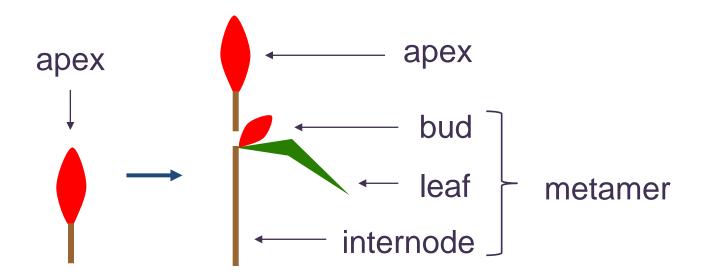
Agent-based models

Differential equation methods Finite element methods

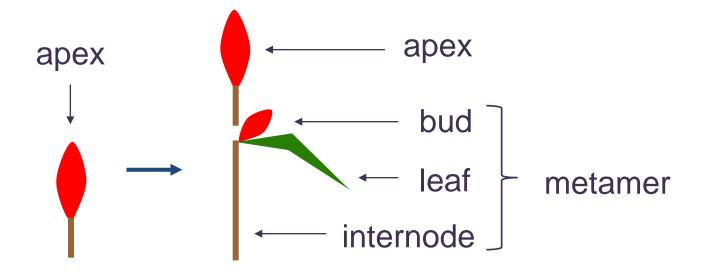
Genetic algorithms

Formal Grammars

How to describe development mathematically?

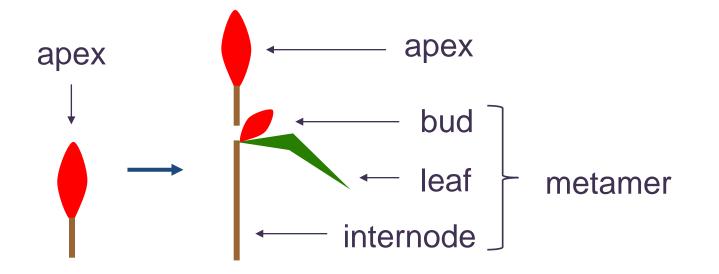


rule

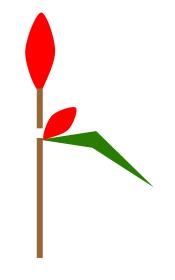


rule

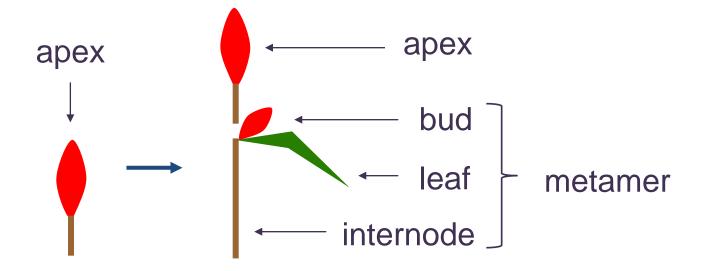




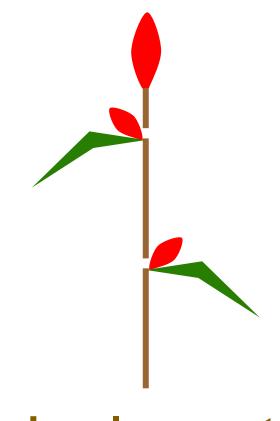
rule



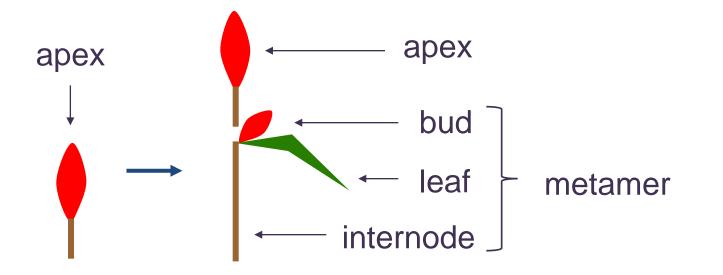
development



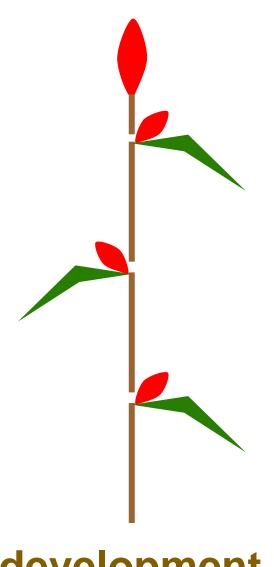
rule



development



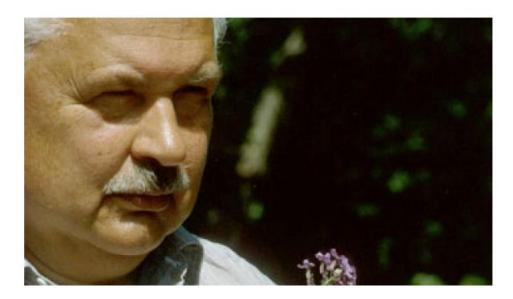
rule

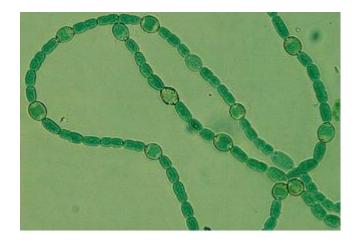


development

L-Systems: a language to describe growth

- Aristid Lindenmayer (1925-1989)
 - Anabaena Catenula
 - 1968 Lindenmayer systems parallel string rewriting systems





L-Systems: a language to describe growth

• Later used to model plants





Przemysław Prusinkiewicz

Algorithmic beauty of plants. P. Prusinkiewicz 1992

- Formal grammar $G = (V, \omega, P)$
- $V \rightarrow$ alphabet of symbols containing elements that can be replaced
- $\omega \rightarrow$ axiom (the initial state of the system)
- $P \rightarrow$ a set of production rules defining how symbols can be replaced
- Example:
 - -V = (A, M)
 - $-\omega = A$
 - $-P = [(A \to MA), (M \to M)]$

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n=0: A

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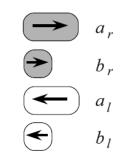
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 - -V = (A, M) n=0: A n=1: MA
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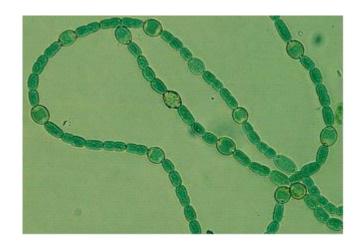
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- Example:
 - n=0: A -V = (A, M)n=1: MA $-\omega = A$
 - $-P = [(A \to MA), (M \to M)]$

n=2: MMA

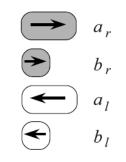
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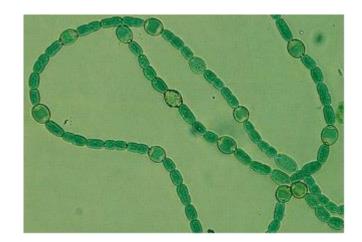
-V = (A, M)	n=0: A
	n=1: MA
$-\omega = A$	n=2: MMA
$-P = [(A \to MA), (M \to M)]$	n=3: MMMA



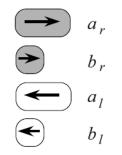


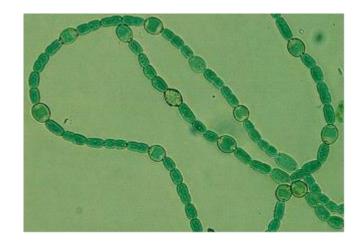
 $p_1: a_r \to a_l b_r$ $p_2: a_l \to b_l a_r$

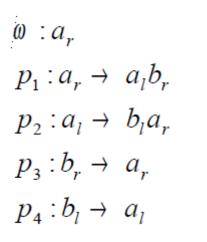


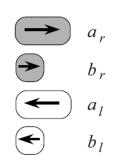


 $p_{1}: a_{r} \rightarrow a_{l}b_{r}$ $p_{2}: a_{l} \rightarrow b_{l}a_{r}$ $p_{3}: b_{r} \rightarrow a_{r}$ $p_{4}: b_{l} \rightarrow a_{l}$

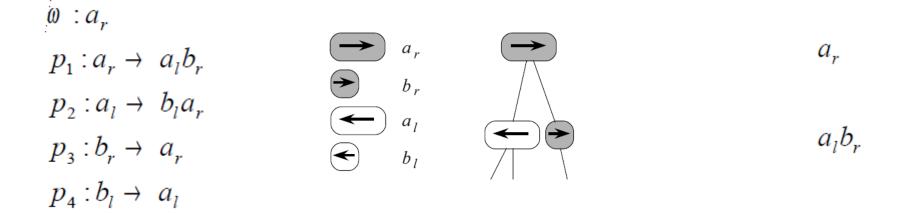


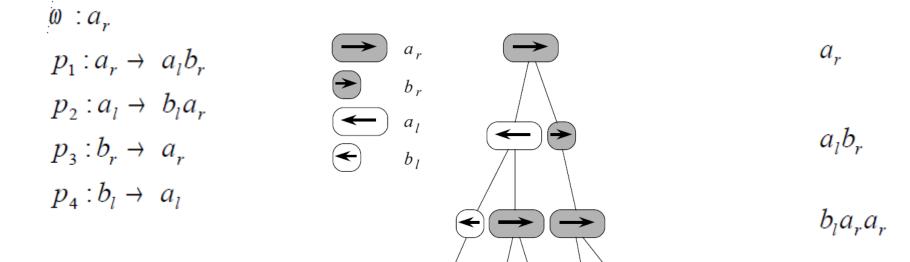




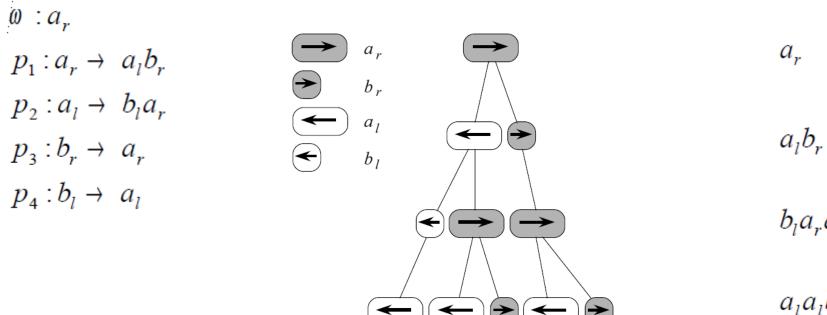








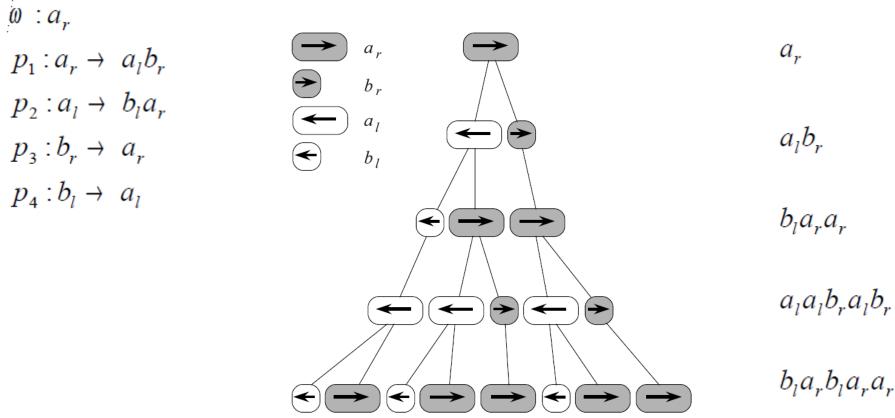
Anabaena Catenula: Model 1



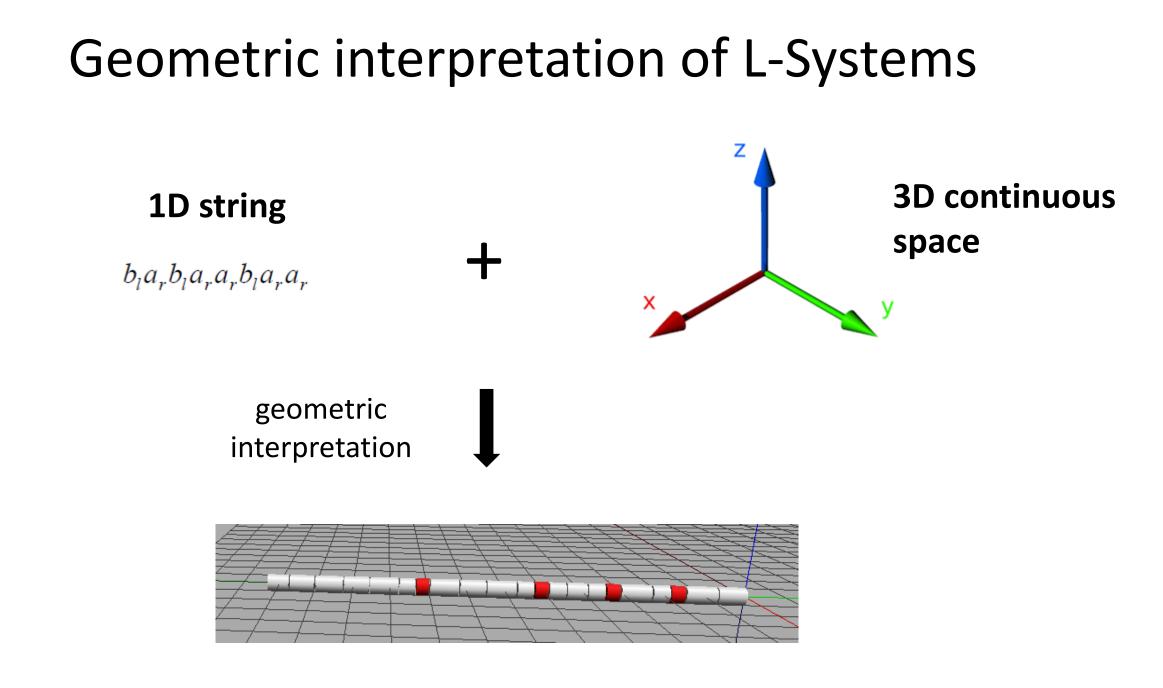
 $b_l a_r a_r$

 $a_l a_l b_r a_l b_r$

Anabaena Catenula: Model 1



 $b_l a_r b_l a_r a_r b_l a_r a_r$



L-Py

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Authors			
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Help Card			₽×
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! DecWidth Decrease the current line	width or set it if a parameter is given. Params : line width (optional).		
SetWidth Set current line width. Pa	rams : line width. Color		
; IncColor Increase the current mat	color erial index or set it if a parameter is given. Params : color index (optional, positive int).		•
Help Card Python Shell	Li	ine 11, Col	lumn 0 (73)

L-Py

1

1	Axiom:
2	
3	derivation length:
4	production:
5	
6	
7	interpretation:
8	
9	
10	endlsystem
11	

L-Py: an L-system simulation framework for modeling plant architecture development based on a dynamic language.

L-Py (production)

• Production rule: $A \rightarrow AB$

A: produce A B

• Move in 3D space in positive x-direction: f(length)

L-Py (interpretation)

• Drawing spheres:

@O(radius)



• Setting colors:

SetColor(range 0-255)

L-Py Example

```
1 # Leafy axis
2
3 from openalea.plantgl.all import *
4 from math import *
5
6 nb vertical segments = 8
                 # in some units (= cm for example)
7 length = 1
8 dl = 0.1
9 scaling = 2
                 # to dilate/contract the leaf
10
11 phi = 180  # Phyllotactic angle
12 h = 1
                 # height of an internode
13
14 module Leaf
15
16 Axiom: /(90) A(0)
17 derivation length: 10
18 production:
19
20 \# try (-90)f(0.05)^{(90)} to translate the leaf on the periphery of the stem
21 A(n):
22 produce F(h) / (phi) [^(-45) Leaf (scaling)]A(n+1)
23
24 interpretation:
25 maximum depth: 2
26
27 # Organ definitions
28 Leaf(x) --> ;(2) Sweep(nerve, section, length, dl, x, width)
29
30 endlsystem
31
```

Parametric L-Systems

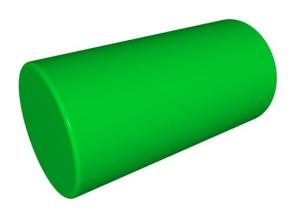
$$A(x) \xrightarrow{x>0} A(x-1)$$
$$A(x) \xrightarrow{x=0} A(x+3)B(x+3)$$

$$A(3) \rightarrow A(2) \rightarrow A(1) \rightarrow A(0) \rightarrow A(3)B(3)$$

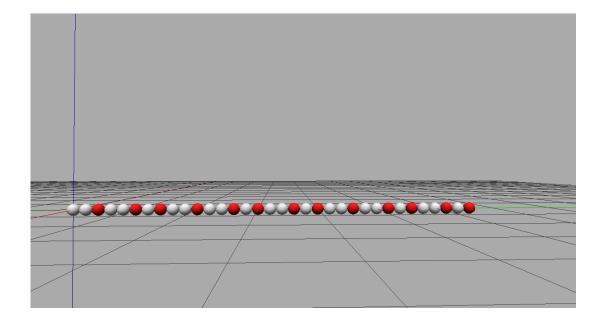
A(x): if x > 0: produce A(x-1)

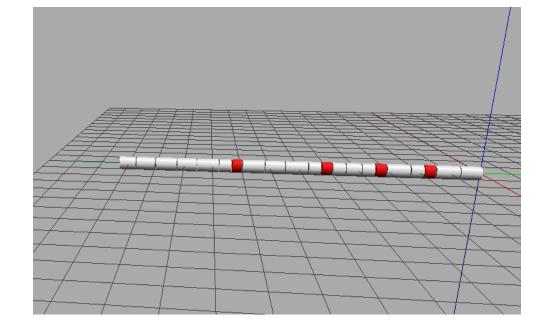
L-Py (interpretation)

• Drawing a cylinder with capital letter F: F(length)



1D growing filaments





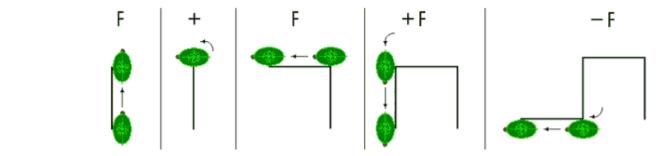
Interpreted with cylinders

Interpreted with spheres

Branching structures?



Turtle graphics

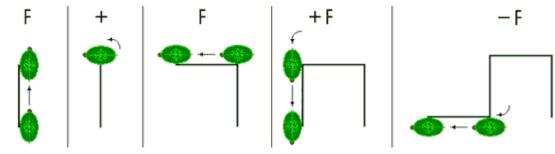


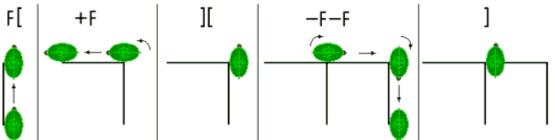
F+F+F-F

Turtle graphics

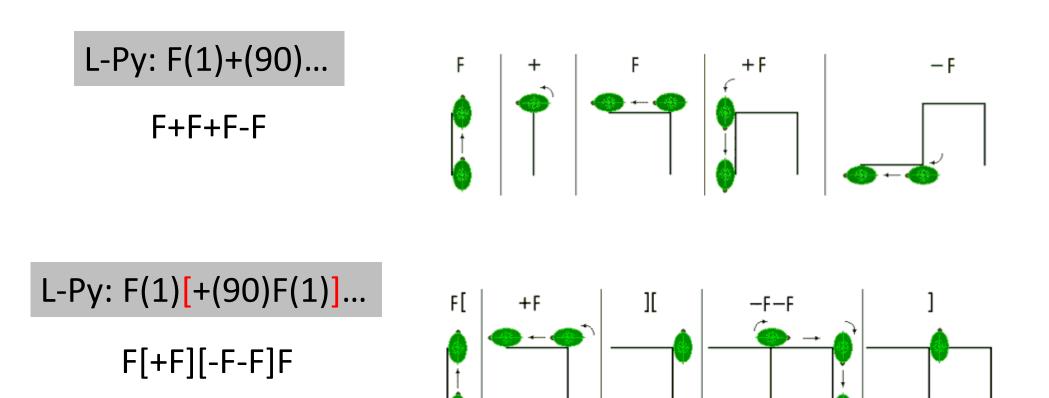


F+F+F-F





Turtle graphics

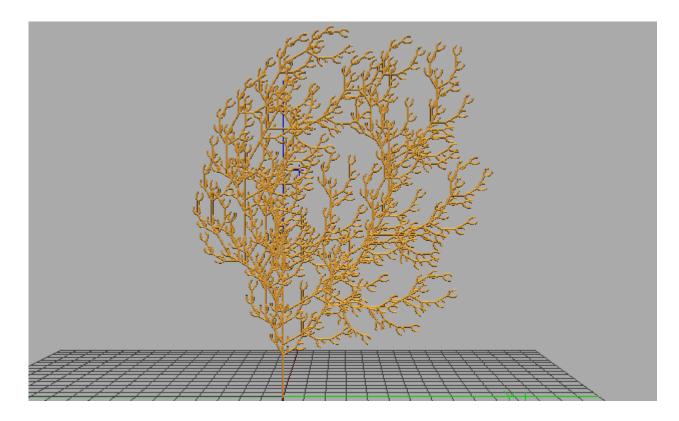


Branching structures 2D

$$\omega: F$$

$$p_1: F \to FF[--F+F+F][+F-F-F]$$

$$\delta = 30^{\circ}$$



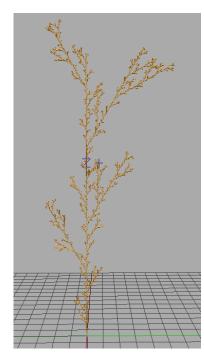
Stochastic L-System

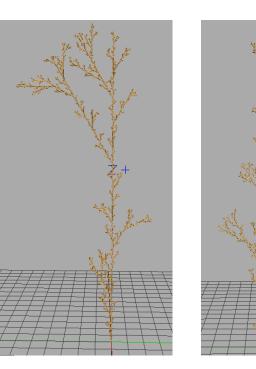
L-Py:

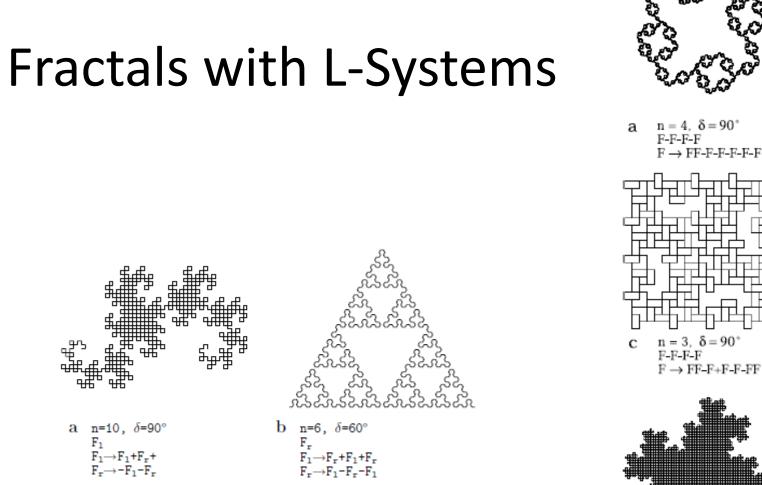
import random

random.random() returns a number of the uniform distribution [0.0 –> 1.0]

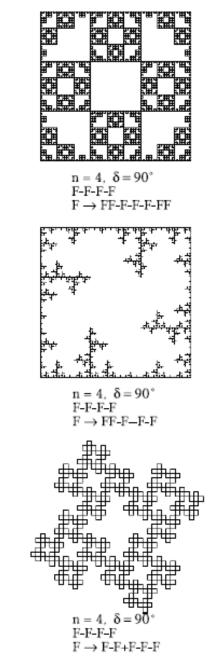
 $\omega: F$ $p_1: F \xrightarrow{0.33} F[+F]F[-F]F$ $p_2: F \xrightarrow{0.33} F[+F]F$ $p_3: F \xrightarrow{0.33} F[-F]F$ $\delta = 30^{\circ}$





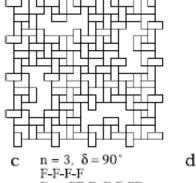


Algorithmic beauty of plants. P. Prusinkiewicz 1992



 $F \rightarrow FF-F-F-F-F+F$

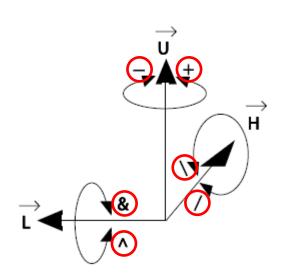
b



n = 5, $\delta = 90^{\circ}$ F-F-F-F

 $F \rightarrow F$ -FF-F-F

L-System 3D

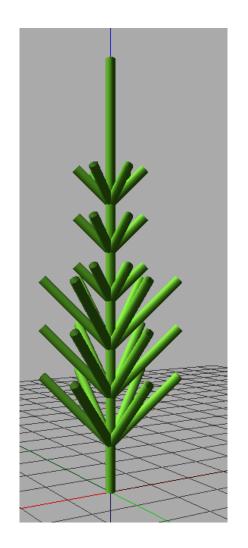


$$\mathbf{R}_{\mathbf{U}}(\alpha) = \begin{bmatrix} \cos \alpha & \sin \alpha & 0 \\ -\sin \alpha & \cos \alpha & 0 \\ 0 & 0 & 1 \end{bmatrix}$$
$$\mathbf{R}_{\mathbf{L}}(\alpha) = \begin{bmatrix} \cos \alpha & 0 & -\sin \alpha \\ 0 & 1 & 0 \\ \sin \alpha & 0 & \cos \alpha \end{bmatrix}$$
$$\mathbf{R}_{\mathbf{H}}(\alpha) = \begin{bmatrix} 1 & 0 & 0 \\ 0 & \cos \alpha & -\sin \alpha \\ 0 & \sin \alpha & \cos \alpha \end{bmatrix}$$

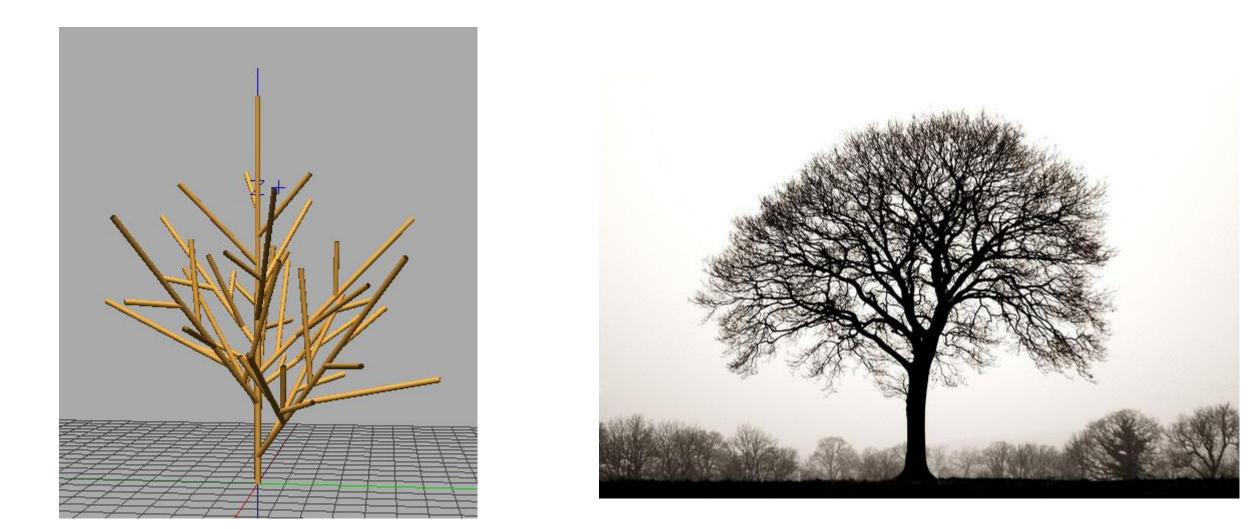
$$\left[\begin{array}{ccc} \vec{H'} & \vec{L'} & \vec{U'} \end{array}\right] = \left[\begin{array}{ccc} \vec{H} & \vec{L} & \vec{U} \end{array}\right] \mathbf{R}_{\mathrm{c}}$$

Equisetum Arvense

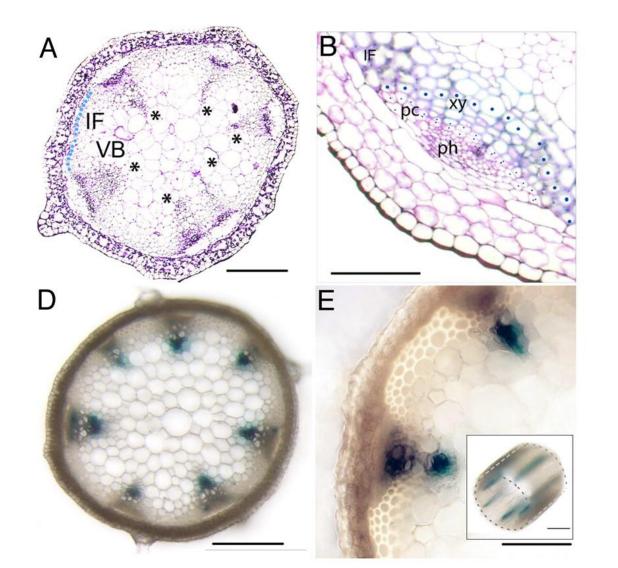


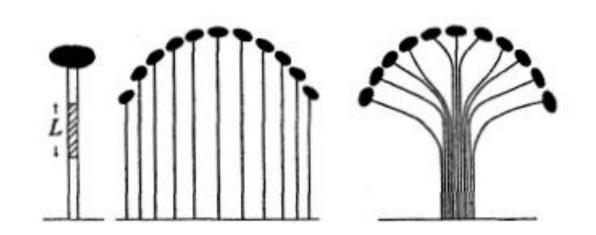


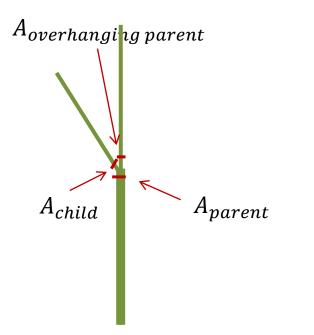
Modeling secondary growth

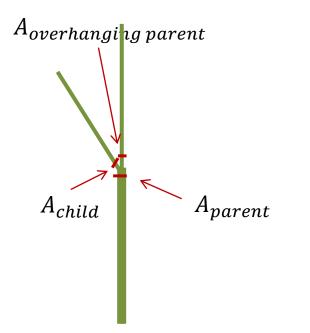


Cross-sections of plant stems

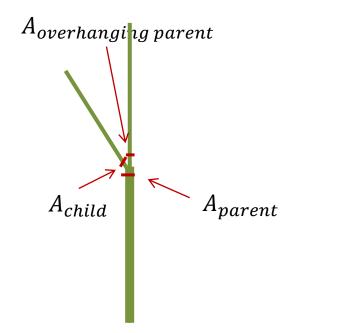




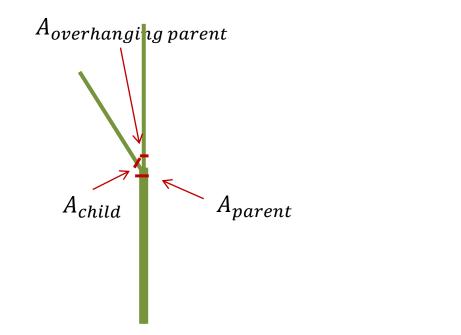




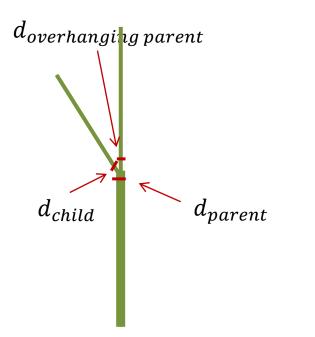
$$A_p = A_c + A_{op}$$



$$\pi r_p^2 = \pi r_c^2 + \pi r_{op}^2$$



$$r_p^2 = r_c^2 + r_{op}^2$$



$$d_p^n = d_c^n + d_{op}^n$$

 $n \in [1,3]$

- $S < F \rightarrow E$ F becomes E, if it is before S in the string
- $F > S \rightarrow E$ F becomes E, if it is after S in the string
- $T < F > S \rightarrow E$ F becomes E, if it is before T and after S

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- $T < F > S \rightarrow E$ F becomes E, if it is before T and after S

baaaaaaaa

 $\begin{array}{rcl}
\omega & : & baaaaaaaa \\
p_1 & : & b < a & \rightarrow b \\
p_2 & : & b & \rightarrow a
\end{array}$

- $S < F \rightarrow E$ F becomes E, if it is before S in the string
- $F > S \rightarrow E$ F becomes E, if it is after S in the string
- $T < F > S \rightarrow E$ F becomes E, if it is before T and after S
 - baaaaaaaa abaaaaaaa

 $\begin{array}{rcl}
\omega & : & baaaaaaaa \\
p_1 & : & b < a & \rightarrow b \\
p_2 & : & b & \rightarrow a
\end{array}$

 $S < F \rightarrow E$ F becomes E, if it is before S in the string $F > S \rightarrow E$ F becomes E, if it is after S in the string $T < F > S \rightarrow E$ F becomes E, if it is before T and after S

. . .

S>[H]M

S[HI[JK]L]MNO

S>[H]M

S[HI[JK]L]MNO

L-Py: ignore: +-

Ignore specific symbols in the L-System string

$$A(x) < B(y) > C(z): \quad x + y + z > 10 \rightarrow E\left(\frac{x + y}{2}\right)F\left(\frac{y + z}{2}\right)$$

$$A(x) < B(y) > C(z): \quad x + y + z > 10 \rightarrow E\left(\frac{x + y}{2}\right)F\left(\frac{y + z}{2}\right)$$

...A(4)B(5)C(6)...

$$A(x) < B(y) > C(z): \quad x + y + z > 10 \rightarrow E\left(\frac{x + y}{2}\right)F\left(\frac{y + z}{2}\right)$$

...A(4)B(5)C(6)...

4 + 5 + 6 > 10

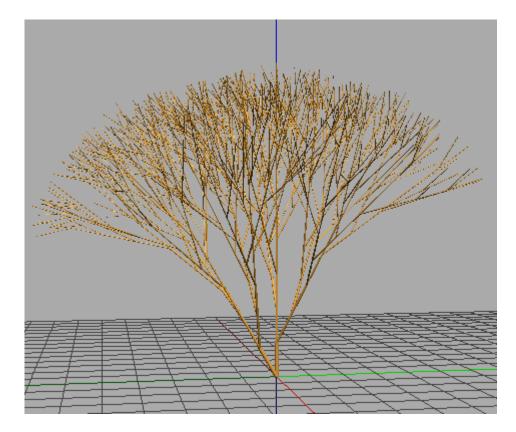
$$A(x) < B(y) > C(z): \quad x + y + z > 10 \rightarrow E\left(\frac{x + y}{2}\right)F\left(\frac{y + z}{2}\right)$$

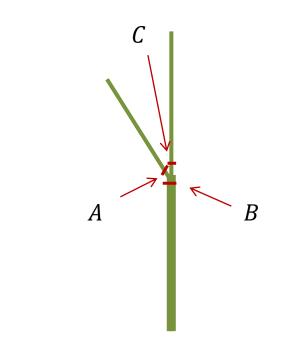
...A(4)B(5)C(6)...

4 + 5 + 6 > 10

 $B(5) \to E(4.5)F(5.5)$

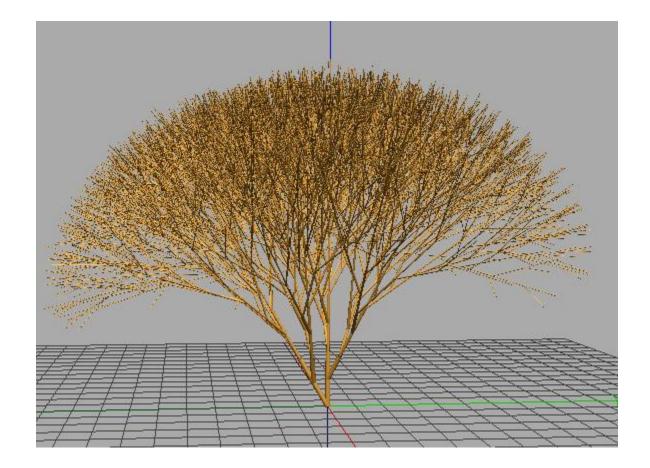
Context-sensitive pipe model



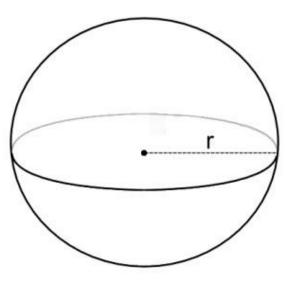


 $B(d_c) > [A(d_p)]C(d_{op}) \rightarrow d_p^n = d_c^n + d_{op}^n$

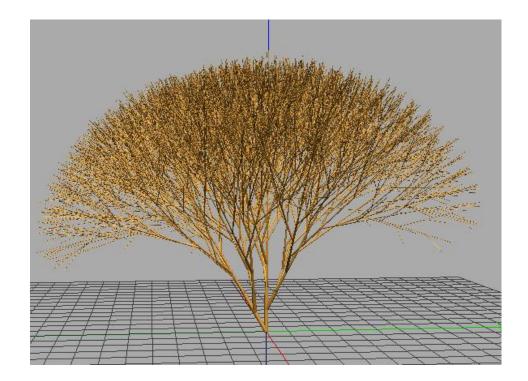
Dense branching structures unrealistic



Constraints of space

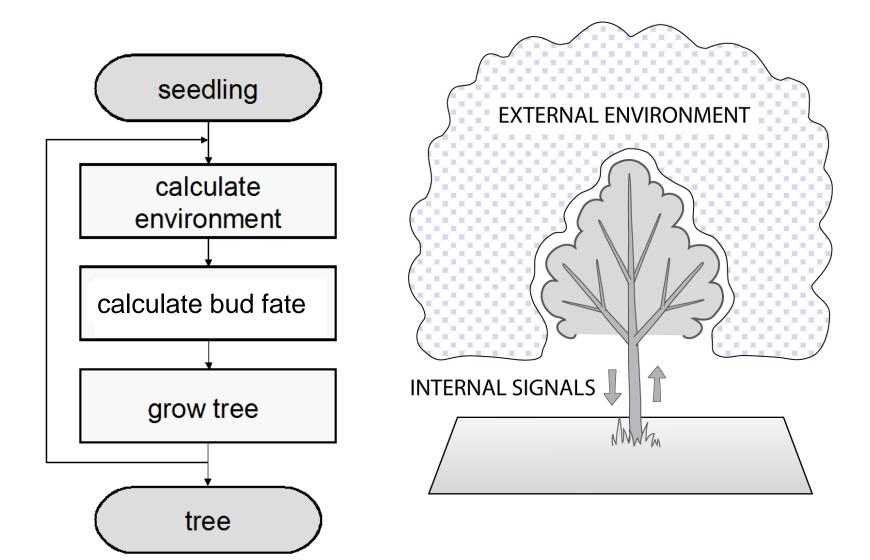


Sphere volume ~ r^3

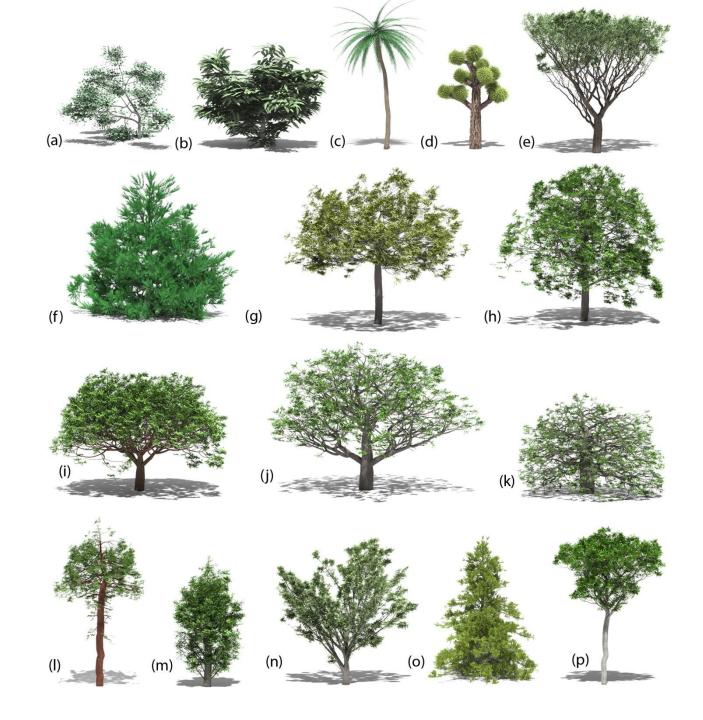


Number of branches ~ 2^r

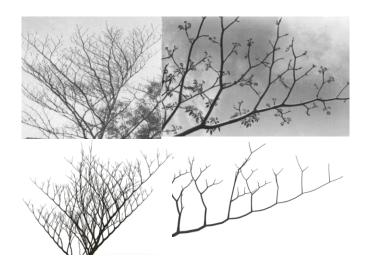
Simulation Overview

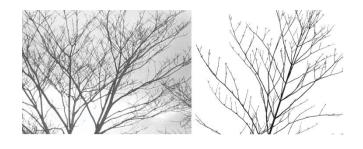






Comparison to real trees





Phellodendron chinense (Model of Scarrone)

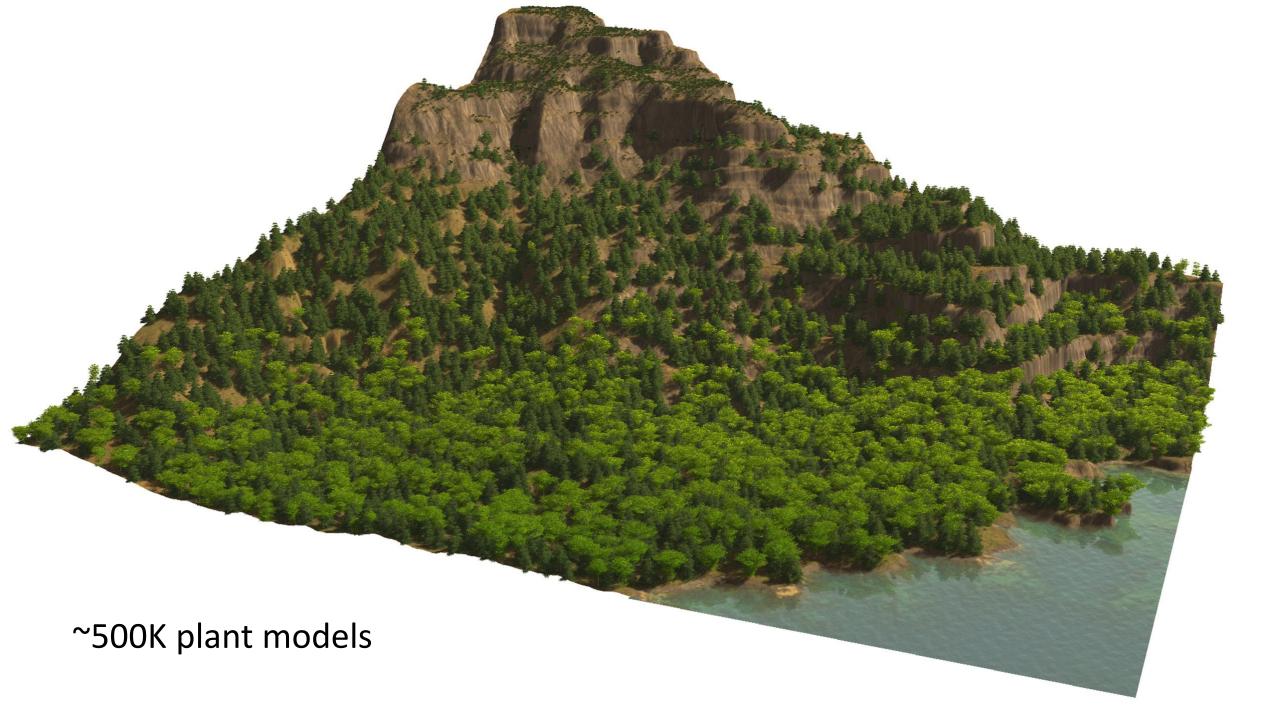
Tabebuia rosea (Model of Leeuwenberg)



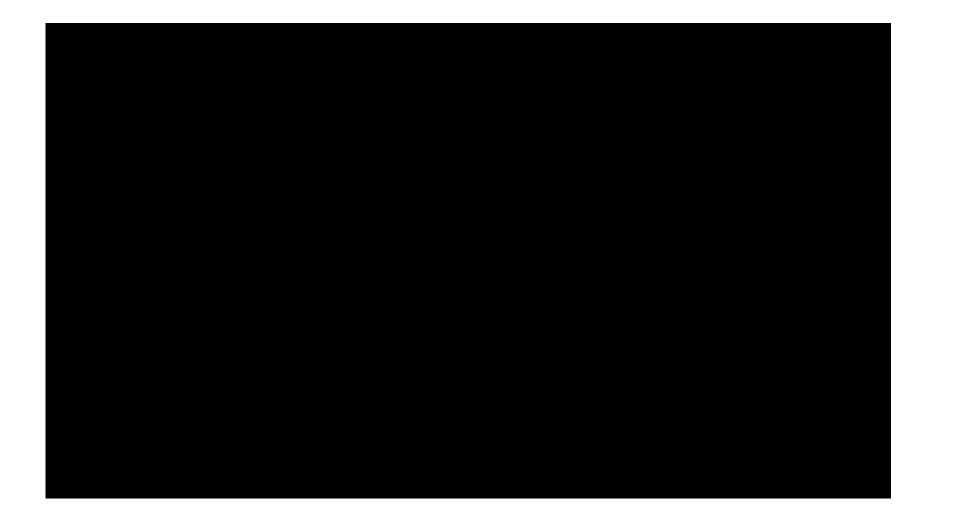
Sequoia sempervirens (Model of Massart)



Delonix regia (Model of Troll)



PFE Project: flower development



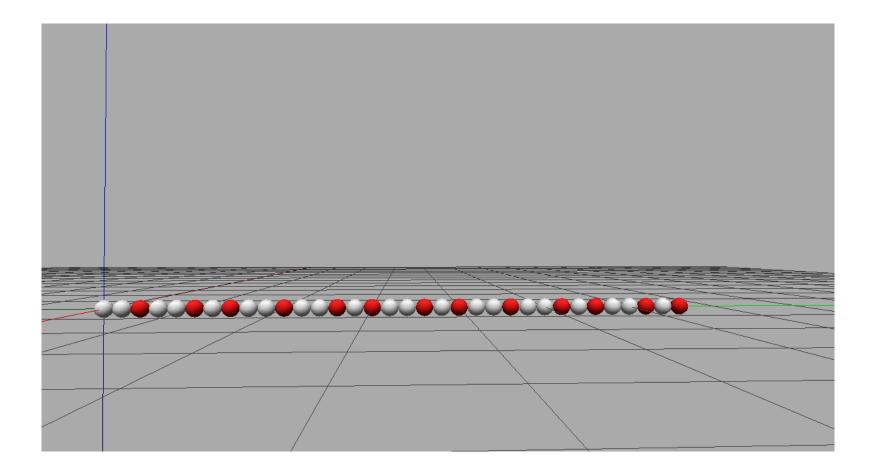
PFE Project: flower development

- Model and quantify the growth of a flower (alternatively your own idea, e.g. tree or aquatic plant growth)
- Implement it using L-Py and quantify the development using statistical methods provided by numpy and scipy
- Send me a pdf presentation with the source code before June 24th by e-mail or a youtube link of the presentation if you can't make it to the exam
- Present your results (24th June) in max. 5 minutes.
 - Explain which biological pattern you tried to model, give a brief description of the L-System used and show your results.
- Same groups as the diffusion presentations

PFE Project evaluation

- ~1/3: *Complexity* of the L-System (context-sensitive, pipe model, parametric, differential equations)
- ~1/3 pts: Aesthetic appeal (use L-Py swept surfaces, animated development with L-Py functions)
- ~1/3 pts: Statistical evaluation that highlights key features of the synthetic development such as distributions of leaves, flowers and stem segments (using histograms, principal component analyses, regressions, testing of hypotheses, etc.)

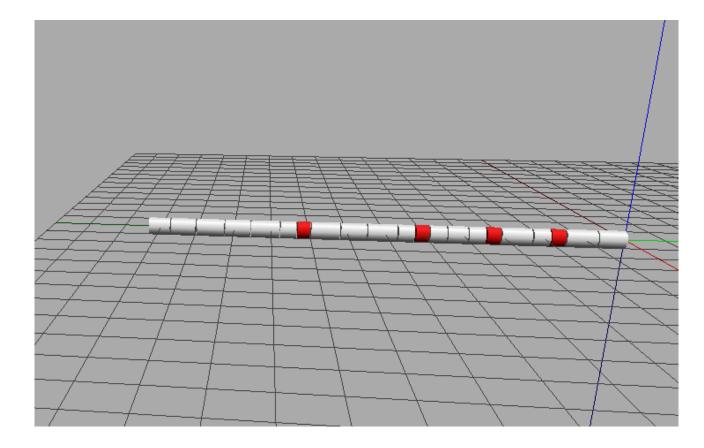
Exercise: Create an anabaena model with L-Py (slides 32-39)



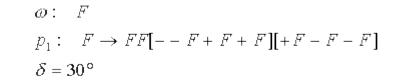
Anabaena Catenula: Model 2

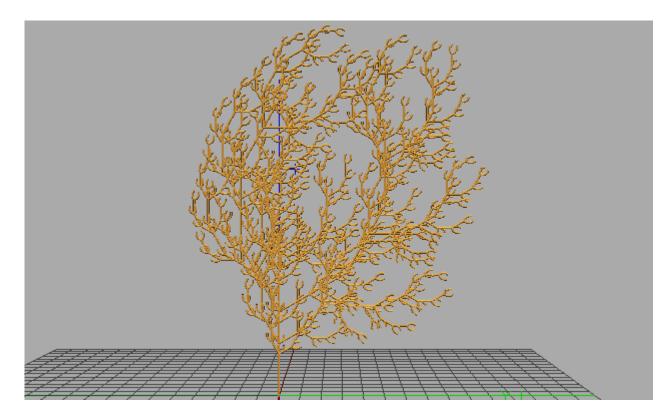
- The previous model does not take into account the size of cells
- In wet lab experiments it was observed that cells A divide every 15 hours and smaller cells B differentiate into cells of type A after 3 hours
- Express the gradual lengthening of cells A over the time period of 15 hours by using a parametric L-System
- A derivation step in the L-System can be set to **3 hours** (also called a plastochron)

Exercise: implement Model 2 with L-Py



Exercise



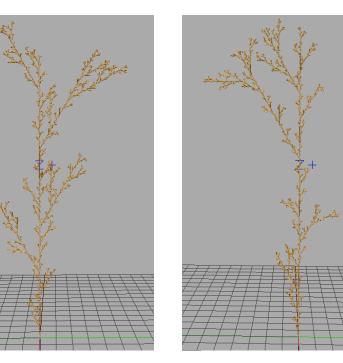


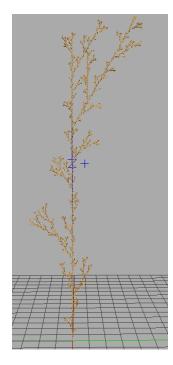
Exercise

L-Py:

import random
random() returns a number from [0,1]

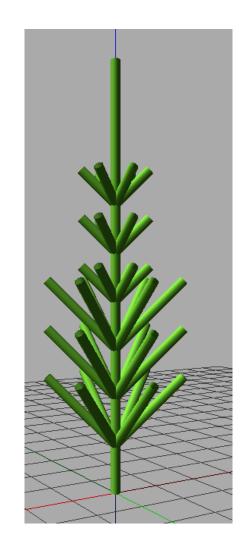
$\omega: F$ $p_1: F \xrightarrow{0.33} F[+F]F[-F]F$ $p_2: F \xrightarrow{0.33} F[+F]F$ $p_3: F \xrightarrow{0.33} F[-F]F$ $\delta = 30^{\circ}$





Exercise

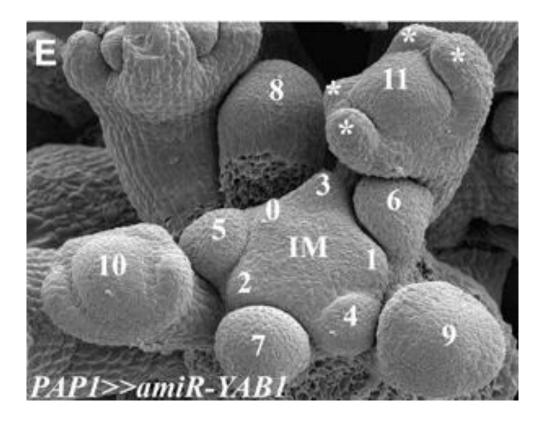




Phyllotaxy



Apical meristem

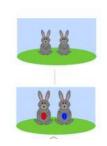


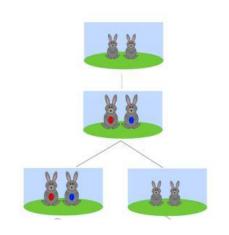
http://www.plantcell.org/content/20/5/1217/F5.expansion

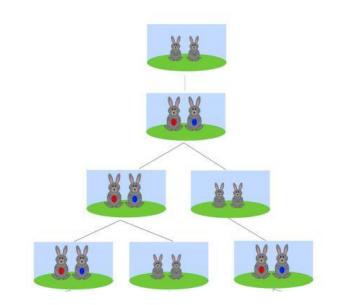
How to mathematically model phyllotaxy?

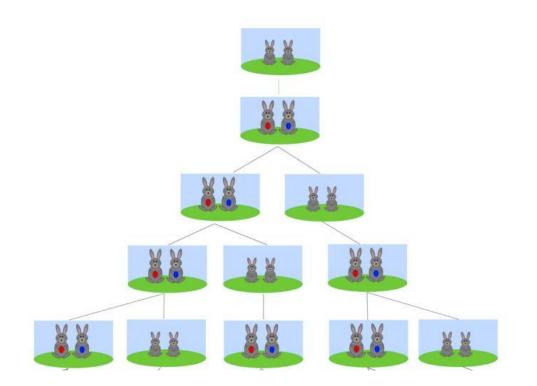


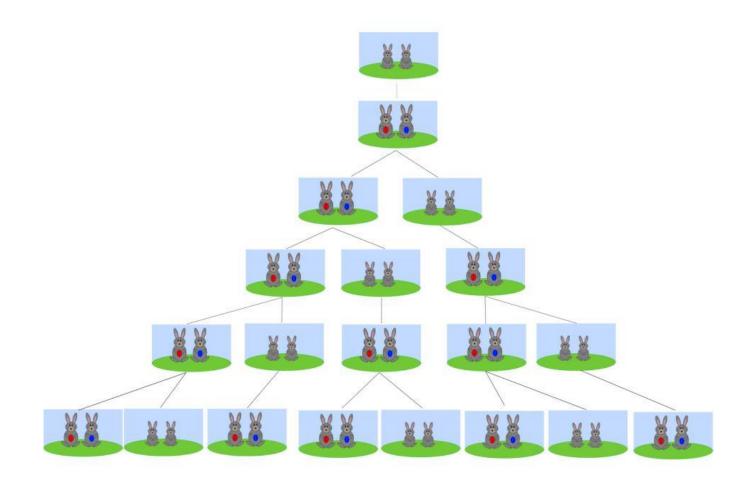












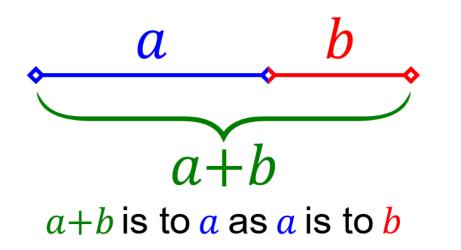
Annual rabbit population growth

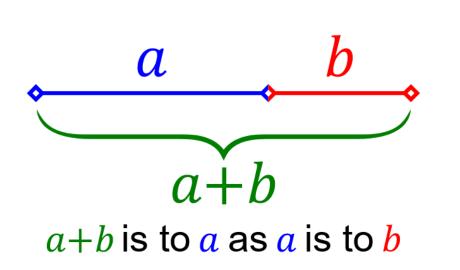
month	J	F	Μ	A	M	J	J	A	S	0	Ν	D	J
juvenile	1	0	1	1	2	3	5	8	13	21	34	55	89
adult	0	1	1	2	3	5	8	13	21	34	55	89	144
total	1	1	2	3	5	8	13	21	34	55	89	144	233

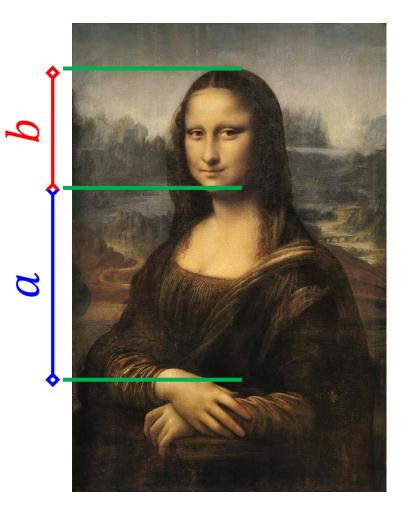
Annual rabbit population growth

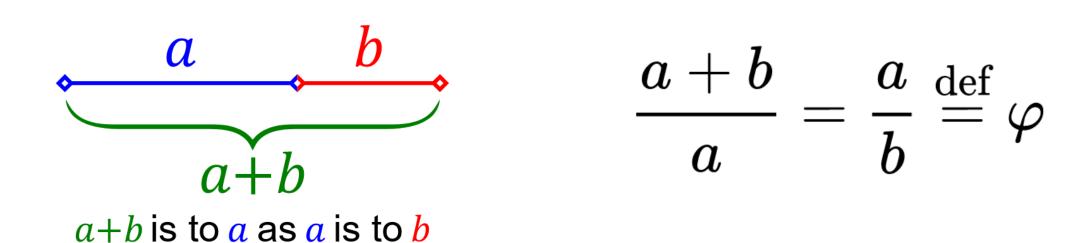
month	J	F	Μ	Α	Μ	J	J	Α	S	0	Ν	D	J
juvenile	1	0	1	1	2	3	5	8	13	21	34	55	89
adult	0	1	1	2	3	5	8	13	21	34	55	89	144
total	1	1	2	3	5	8	13	21	34	55	89	144	233

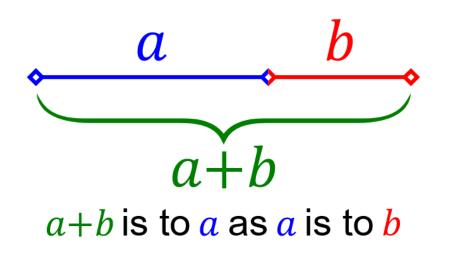
$$F_n = F_{n-1} + F_{n-2}$$











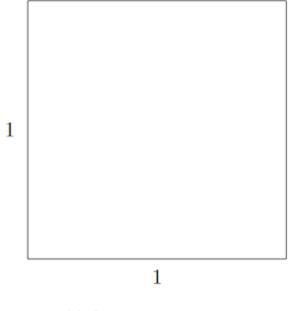
$$rac{a+b}{a}=rac{a}{b}\stackrel{ ext{def}}{=}arphi$$

$$arphi = rac{1+\sqrt{5}}{2} = 1.6180339887\dots$$

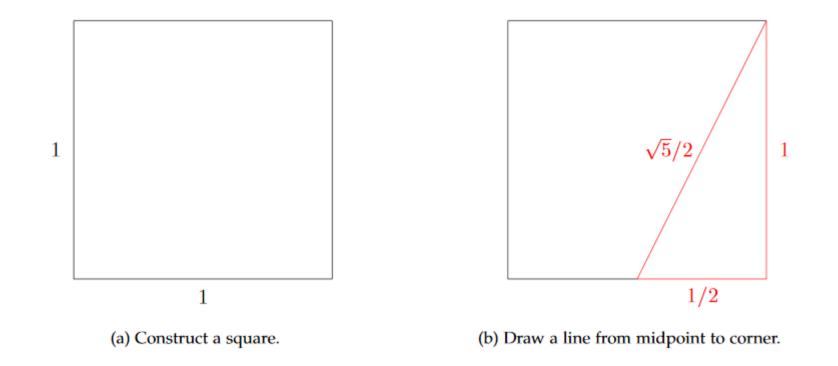
Fibonacci and Golden Ratio

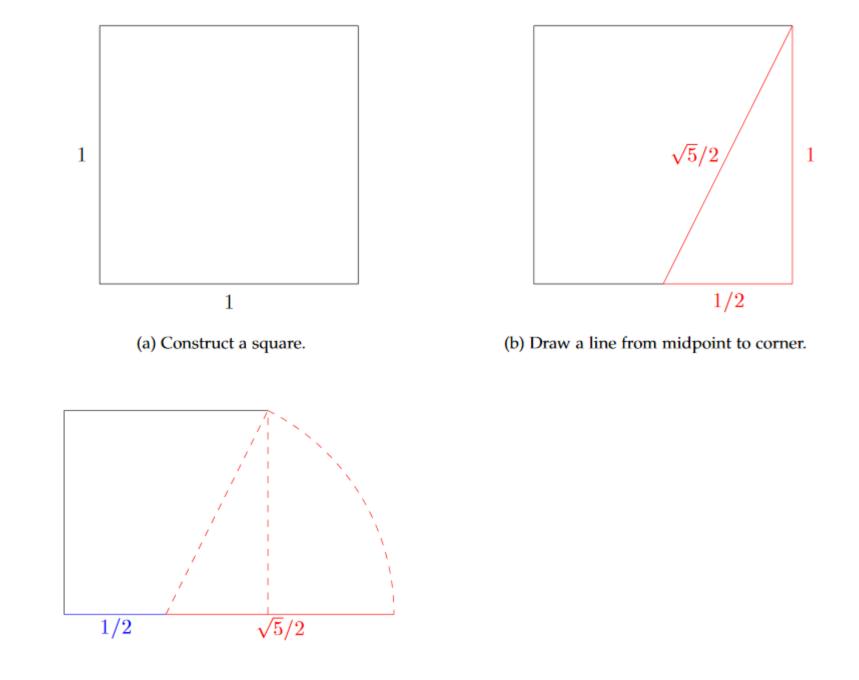
n	F_{n+1}/F_n	value	$F_{n+1}/F_n-\Phi$
1	1/1	1.0000	-0.6180
2	2/1	2.0000	0.3820
3	3/2	1.5000	-0.1180
4	5/3	1.6667	0.0486
5	8/5	1.6000	-0.0180
6	13/8	1.6250	0.0070
7	21/13	1.6154	-0.0026
8	34/21	1.6190	0.0010
9	55/34	1.6176	-0.0004
10	89/55	1.6182	0.0001

Ratio of consecutive Fibonacci numbers approaches Φ .

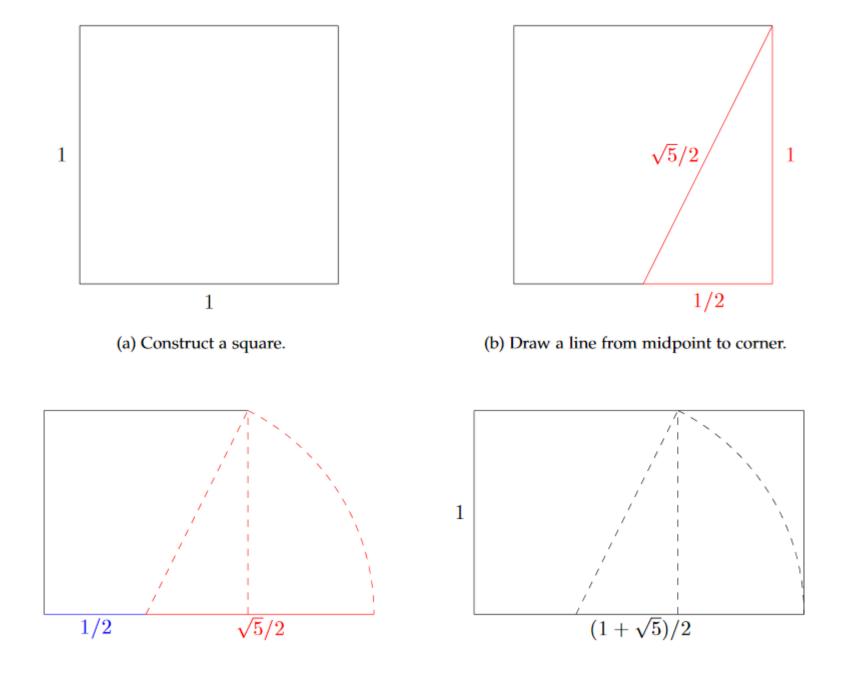


(a) Construct a square.



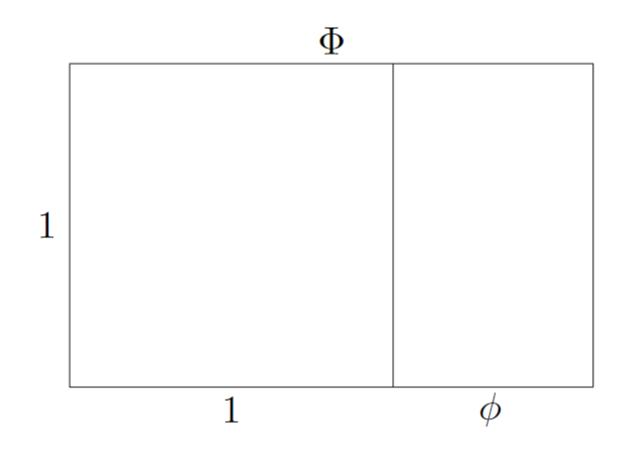


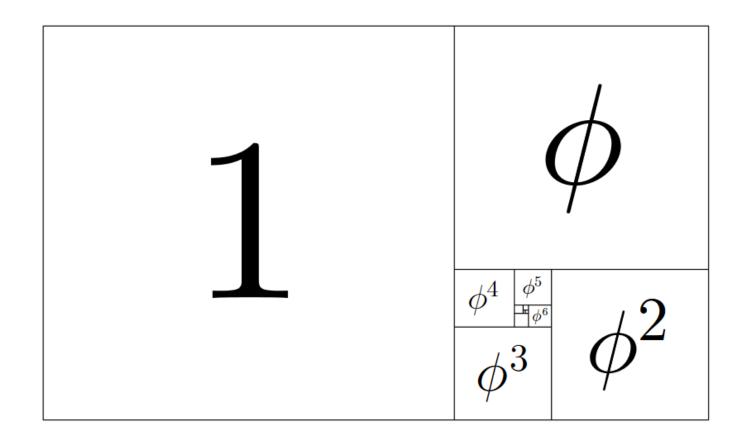
(c) Draw an arc using the internal line as radius.



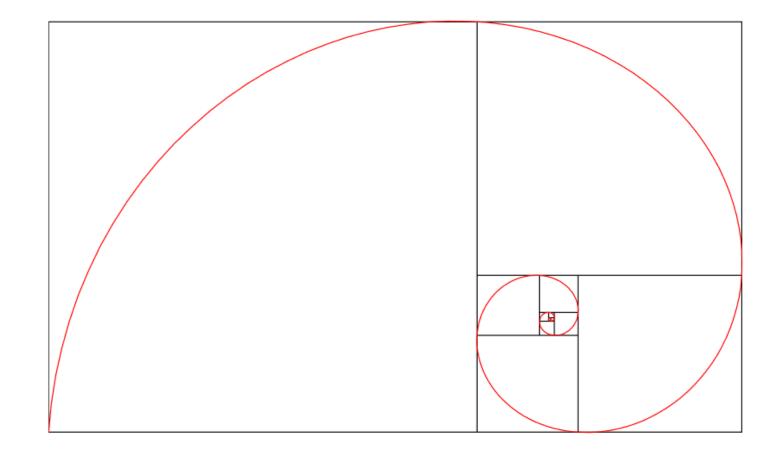
(c) Draw an arc using the internal line as radius.

(d) Complete the golden rectangle.





Golden Spiral



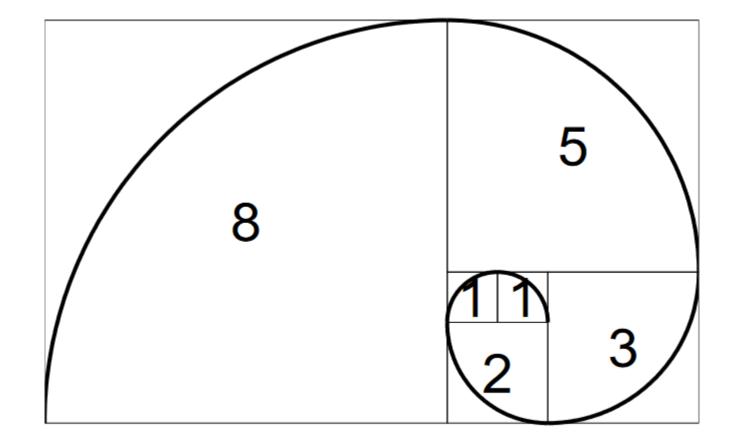
Fibonacci Spiral



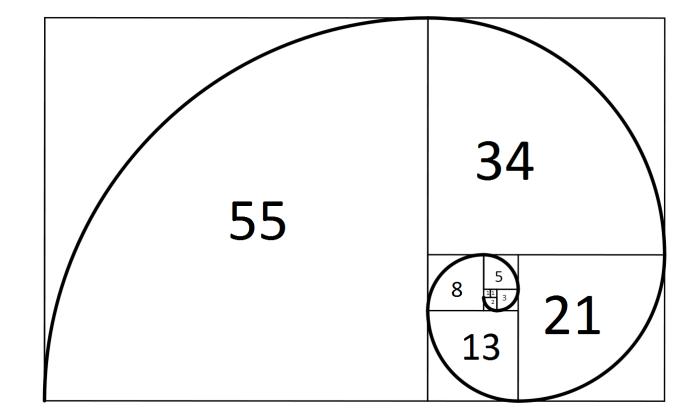
(a)
$$n = 2$$
: $1^2 + 1^2 = 1 \times 2$.

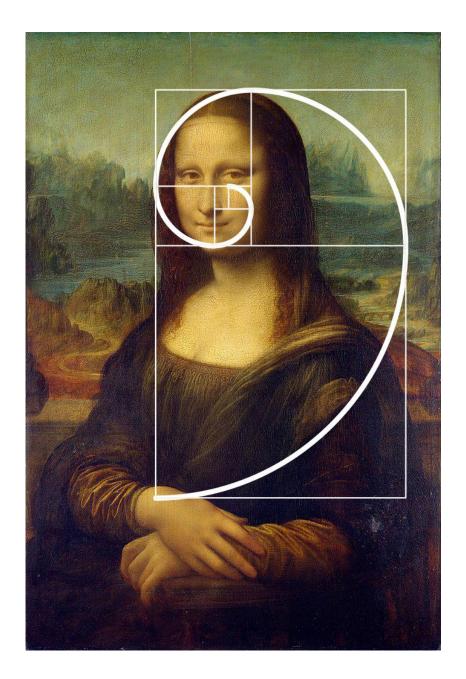
(b) n = 3: $1^2 + 1^2 + 2^2 = 2 \times 3$.

Fibonacci Spiral



Fibonacci Spiral

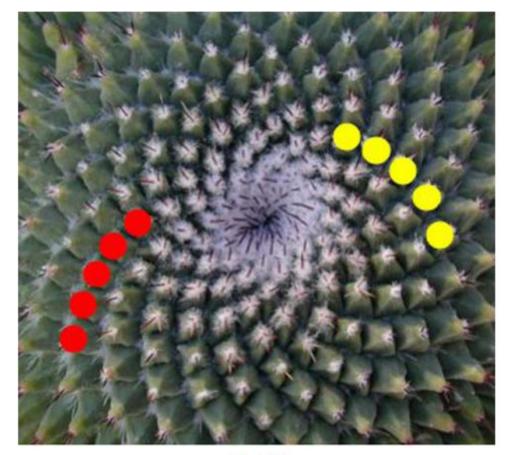




Examples from Nature

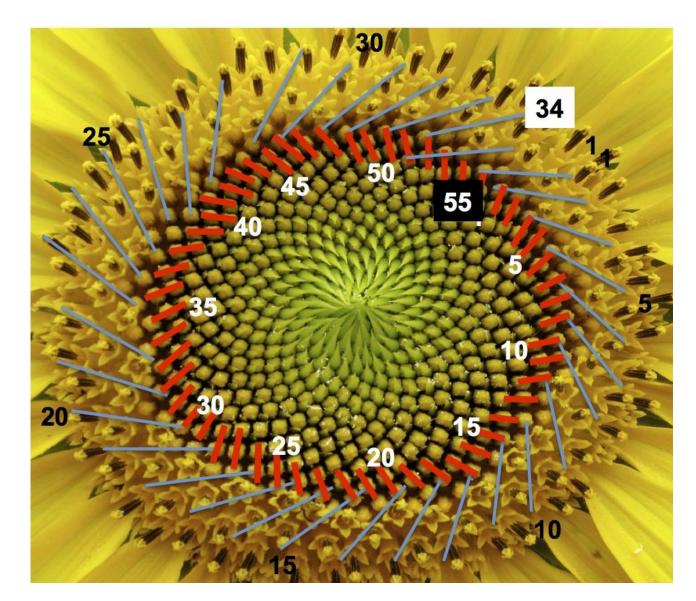


Parastichies



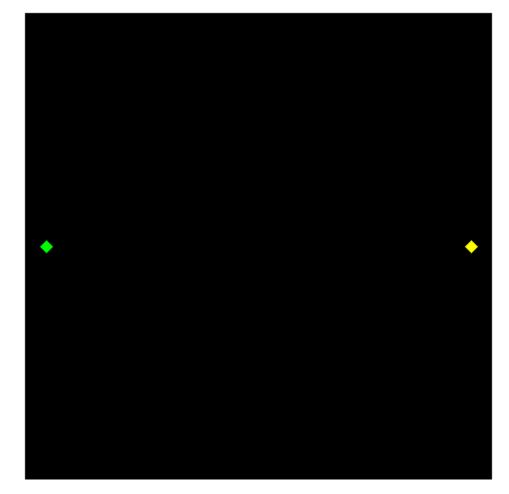
0, 1, 1, 2, 3, 5, 8, 13, 21, 34, 55, 89, 144,

Sunflower

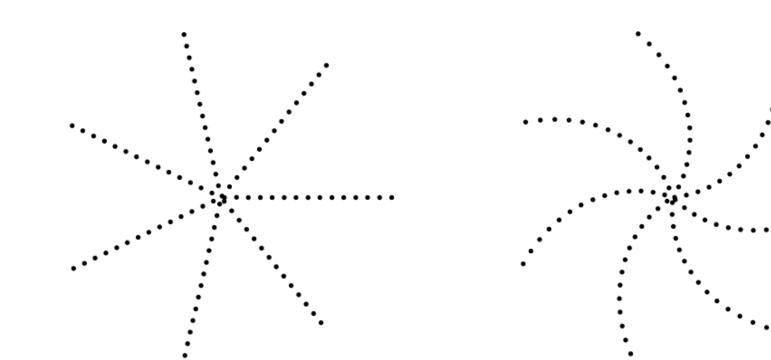


Sunflower Model

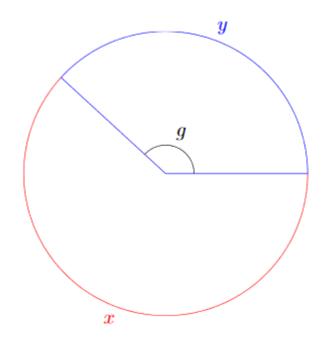
- New seeds ae generated in the center
- Seeds move in a linear direction away from the center
- Each new seed selects a new moving direction by rotating with a given angle in respect to the previous seed



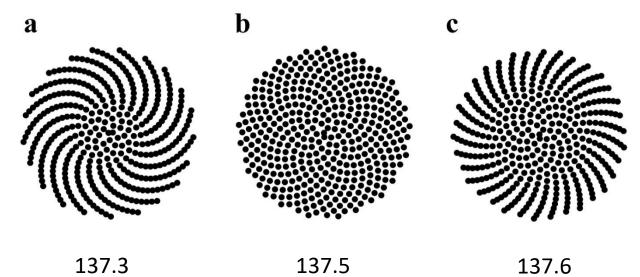
Example Models (1/7) and (PI -3)



The Golden Angle 137.5



Different divergent angles

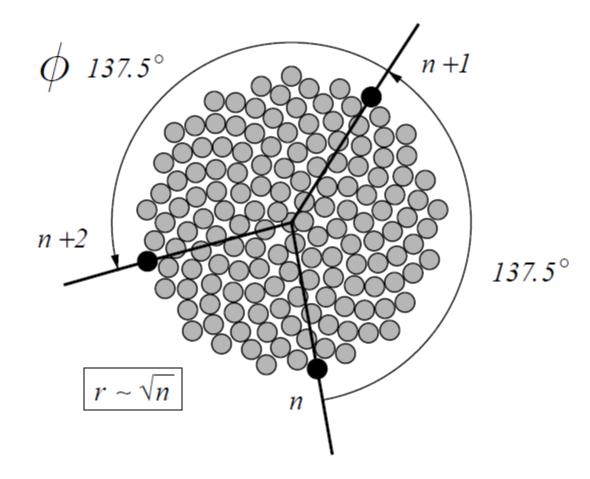


137.3

137.6

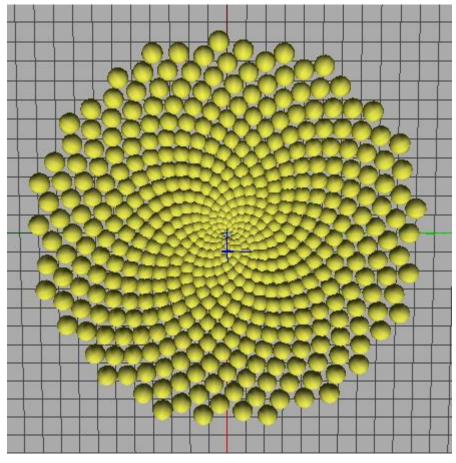
Vogels equation

$$\phi = n * 137.5^{\circ}, \qquad r = c\sqrt{n}$$





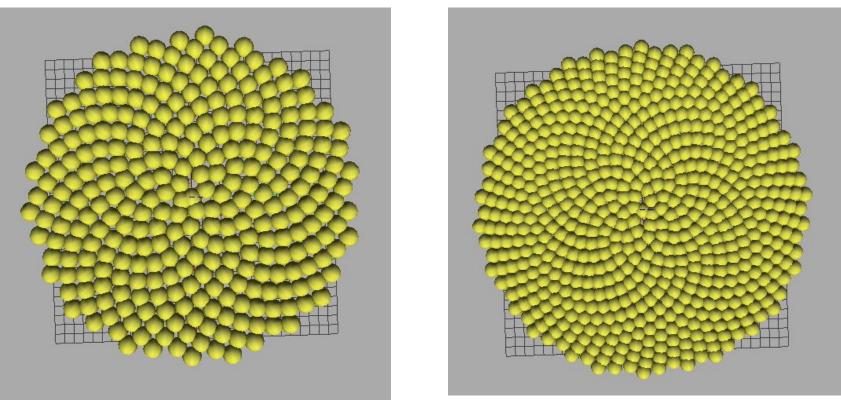
Sunflower Model



Fibonacci, 137.5

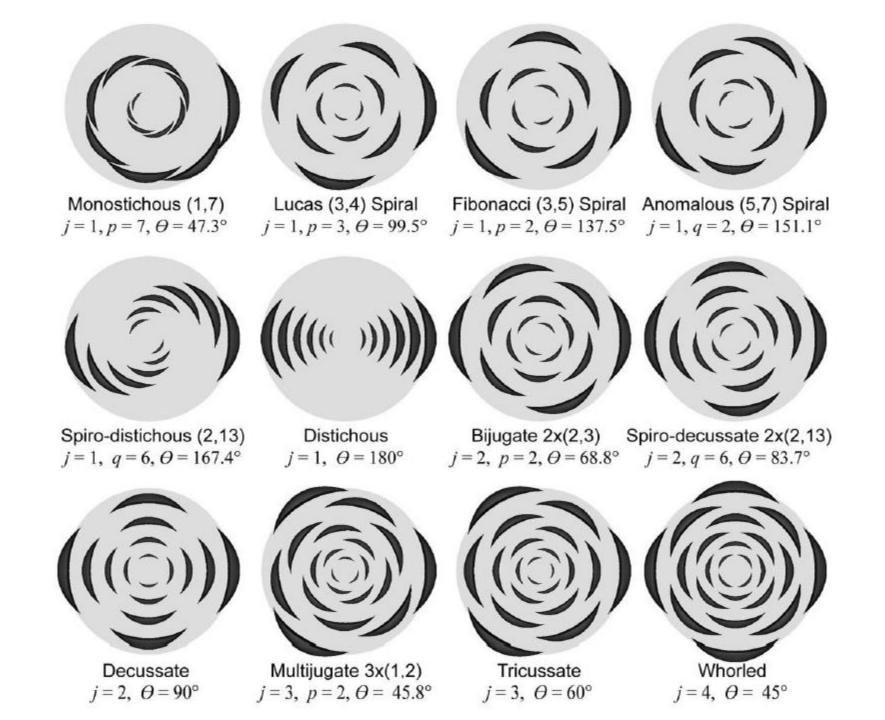


Other known phyllotaxies

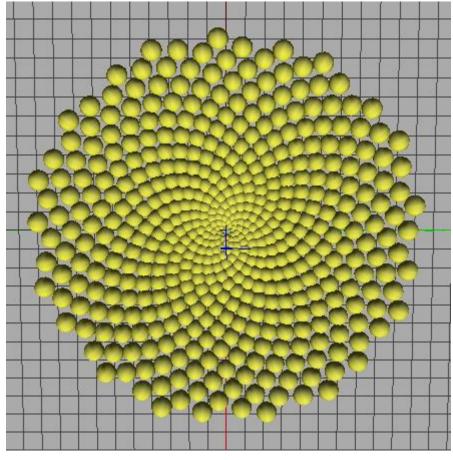


Bijugate, 68.8

Lucas, 99.5



Exercise







Exercise: Ananas Model (cylinder)



