



Procedural Modeling

CS334 Spring 2022

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Procedural Modeling

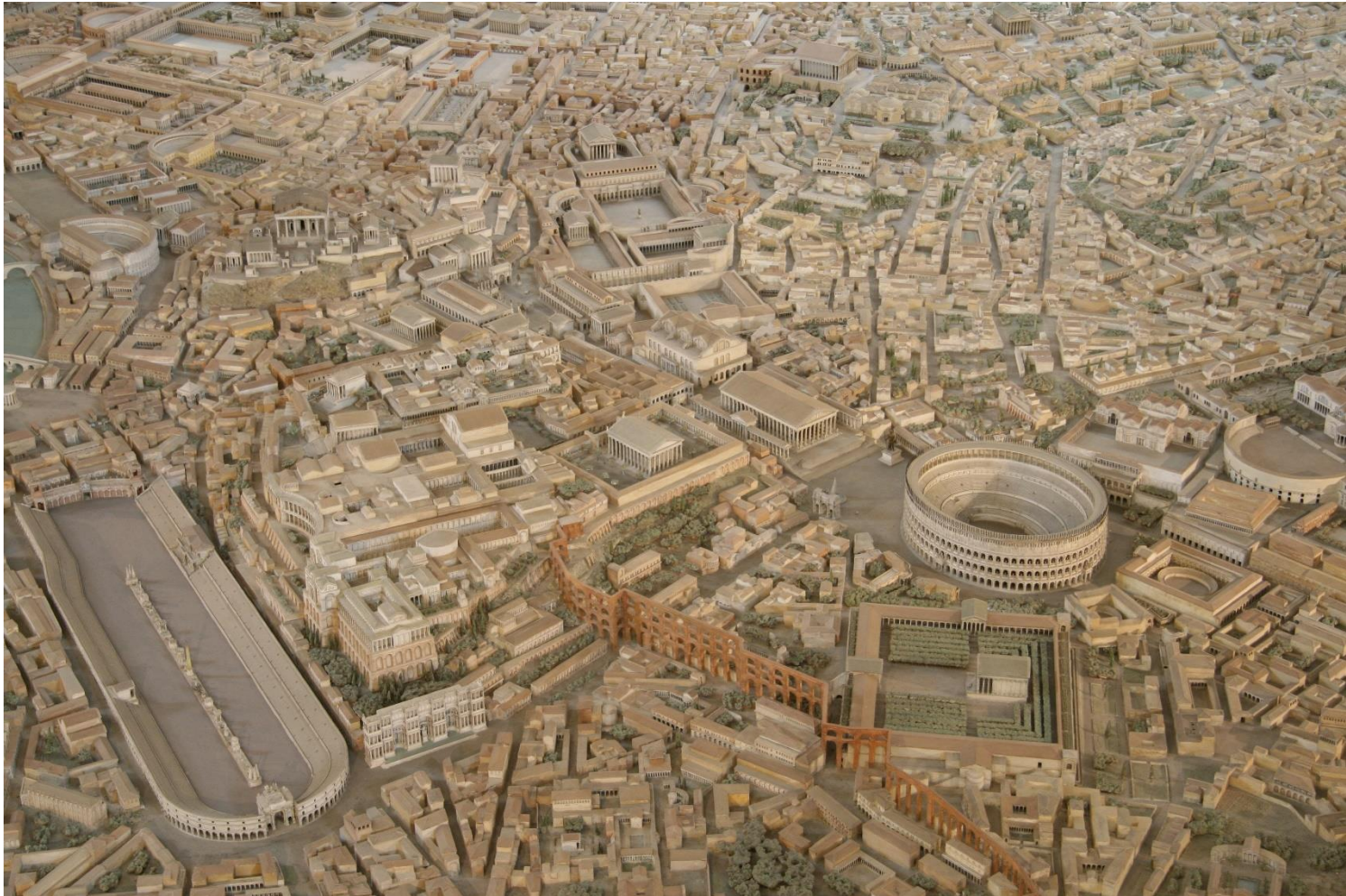
- Apply algorithms for producing objects and scenes
- The rules may either be embedded into the algorithm, configurable by parameters, or externally provided



Examples



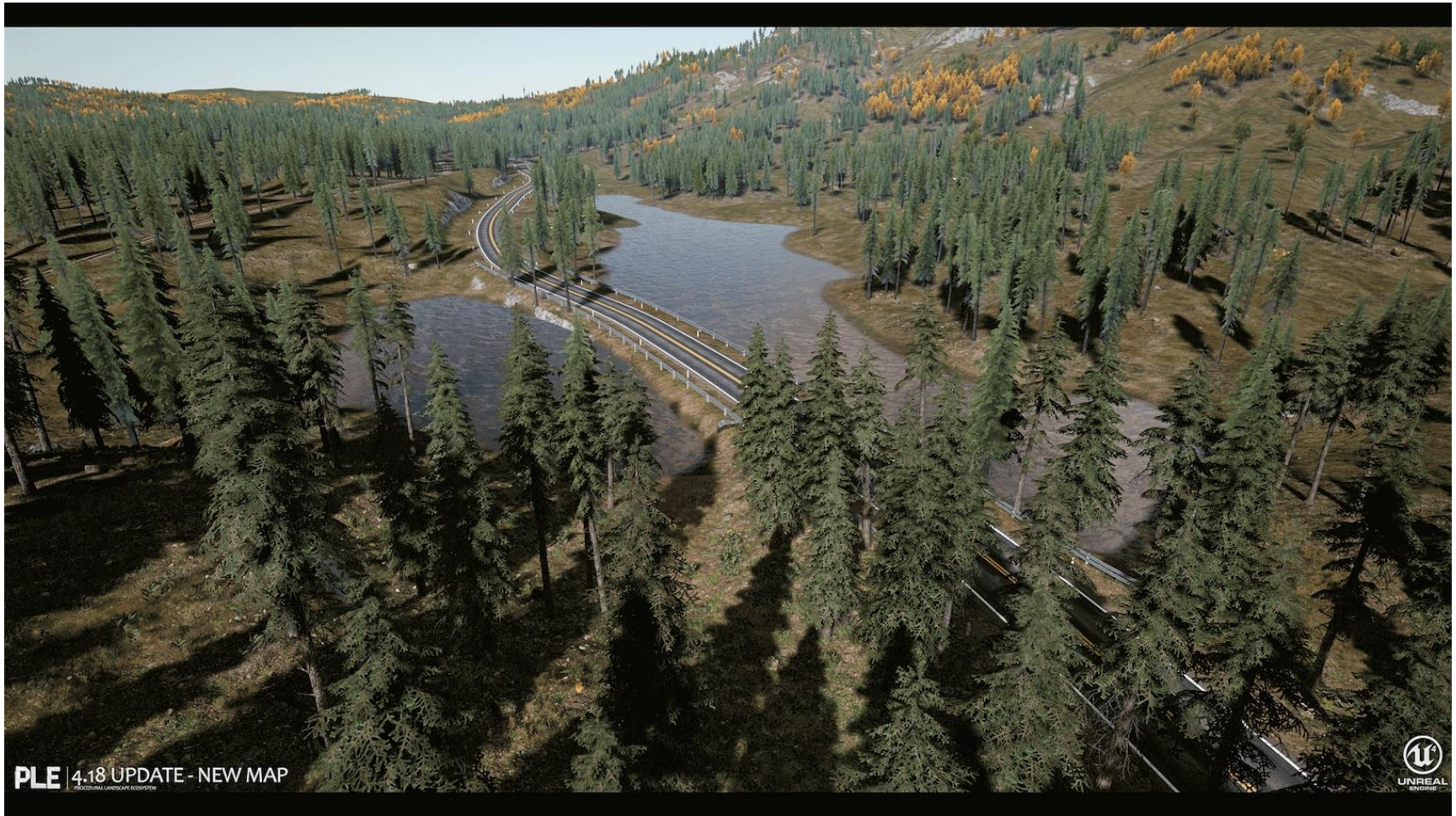
Examples

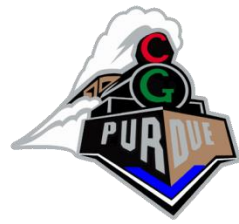


Examples



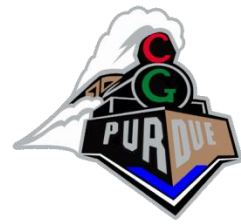
Examples





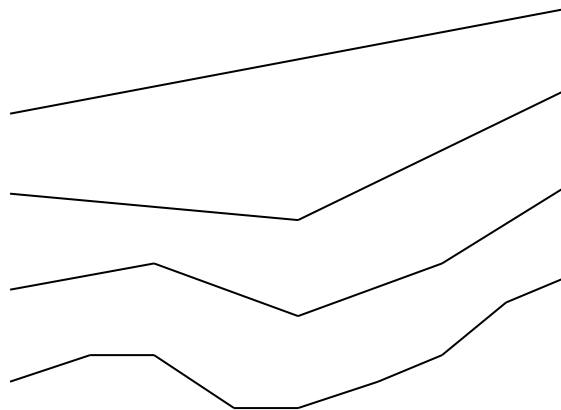
Procedural Modeling

- Fractals
- Terrains
- Image-synthesis
 - Perlin Noise
 - Clouds
- Plants
- Cities
- And procedures in general...



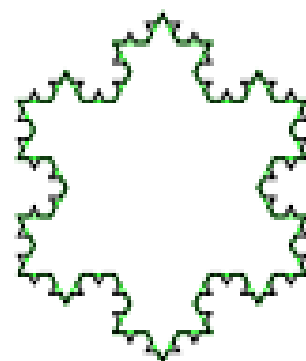
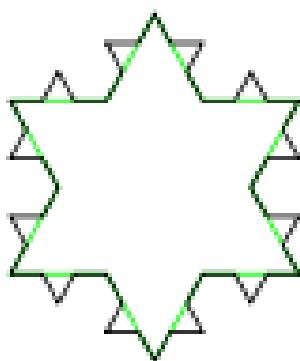
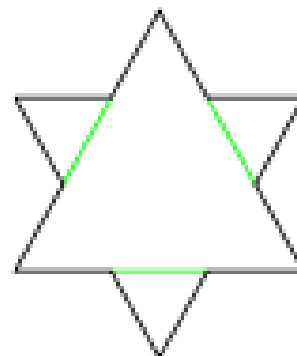
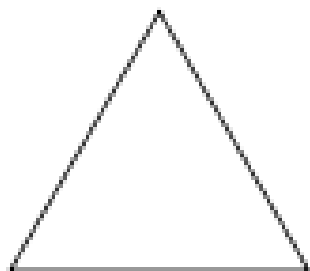
Linear Fractals

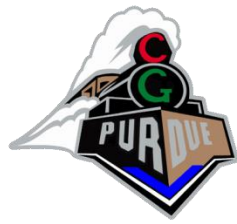
- Definition: a shape is repeated in different orientations/scales -- a never-ending pattern.
- Consider a simple line fractal
 - Split a line segment, randomize the height of the midpoint by some number in the $[-r,r]$ range
 - Repeat and randomize by $[-r/2,r/2]$
 - Continue until a desired number of steps, randomizing by half as much each step





Koch Snowflake





Demo

- <http://nolandc.com/sandbox/fractals/>



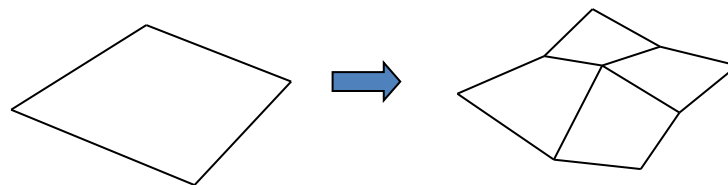
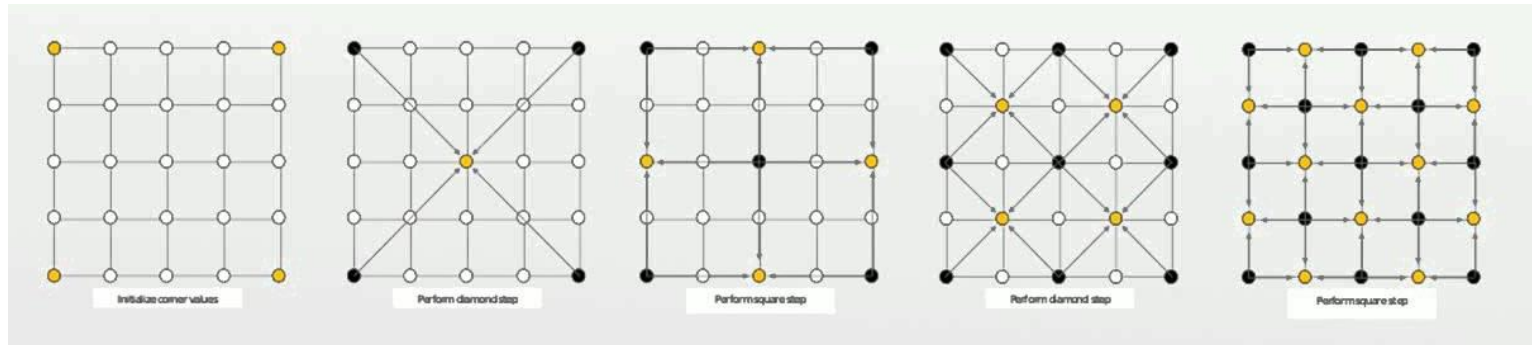
Non-linear Fractals

- Example: Mandelbrot Set
 - Iterations of “ $z_{n+1} = z_n^2 + C$ ” starting at $z_0 = c_0$
 - <https://www.youtube.com/watch?v=pCpLWbHVNhk>



Fractals and Terrains

- A similar process can be applied to squares in the xz plane (Diamond-Square Algorithm):
 - At each step, an xz square is subdivided into 4 squares, and the y component of each new point is randomized
 - By repeating this process recursively, we can generate a mountain landscape





Terrains

- A similar process can be applied to squares in the xz plane
 - At each step, an xz square is subdivided into 4 squares, and the y component of each new point is randomized
 - By repeating this process recursively, we can generate a mountain landscape

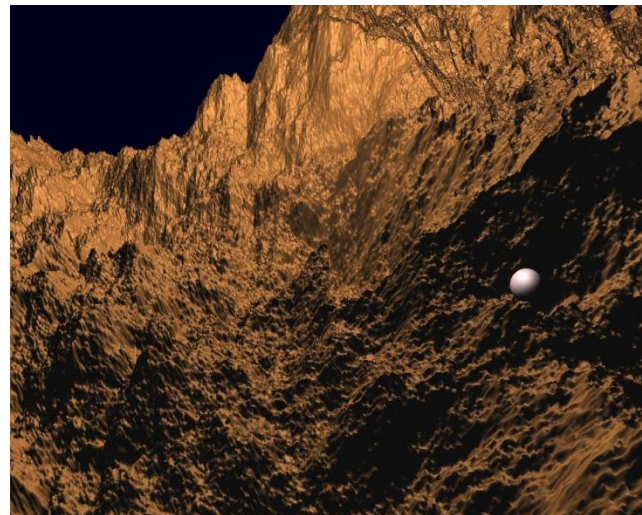




Image Synthesis

- Procedurally generate an image (pixels)



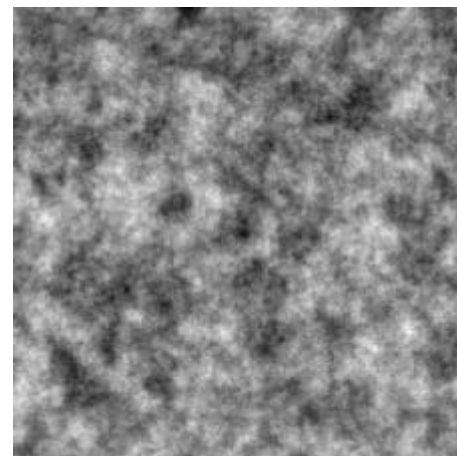


Idea: Perlin Noise

- Procedurally generate noise

- <http://js1k.com/demo/543>

- See other slides





City Modeling

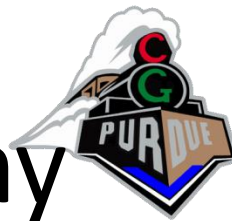
- Procedural Modeling of Cities
(more on this later...)



Plant Modeling

- [The Algorithmic Beauty of Plants](#)

Background: Chomsky Hierarchy



- Type 0 grammars
 - Unrestricted, recognized by Turing machine
- Type 1 grammars
 - Context-sensitive grammars
- Type 2 grammars
 - Context-free grammars
- Type 3 grammars
 - Regular grammars (e.g., regular expressions)

Lindenmayer system (or L-system)



- A context-free or context-sensitive grammar
- All rules are applied in “every iteration” before jumping to the next level/iteration
- Can be deterministic or non-deterministic



L-system

- Variables: a
- Constants: $+$, $-$ (rotations of $+$ or $-$ 90 degrees)
- Initial string (axiom): $s=a$
- Rules: $a \rightarrow a+a-a-a+a$



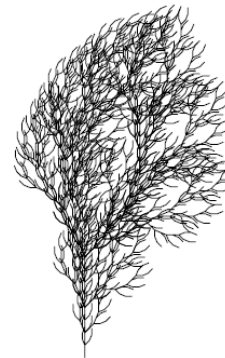
(Context-Free) L-system for Plants



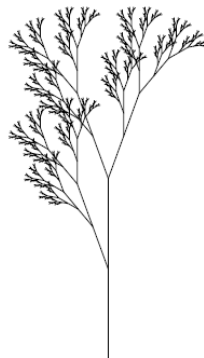
a
 $n=5, \delta=25.7^\circ$
 F
 $F \rightarrow F[+F]F[-F]F$



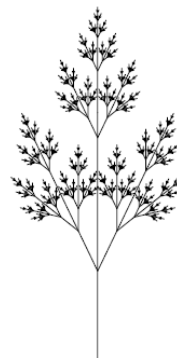
b
 $n=5, \delta=20^\circ$
 F
 $F \rightarrow F[+F]F[-F][F]$



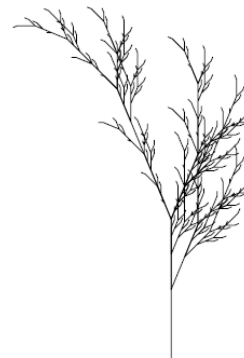
c
 $n=4, \delta=22.5^\circ$
 F
 $F \rightarrow FF-[-F+F+F]+$
 $[+F-F-F]$



d
 $n=7, \delta=20^\circ$
 X
 $X \rightarrow F[+X]F[-X]+X$
 $F \rightarrow FF$



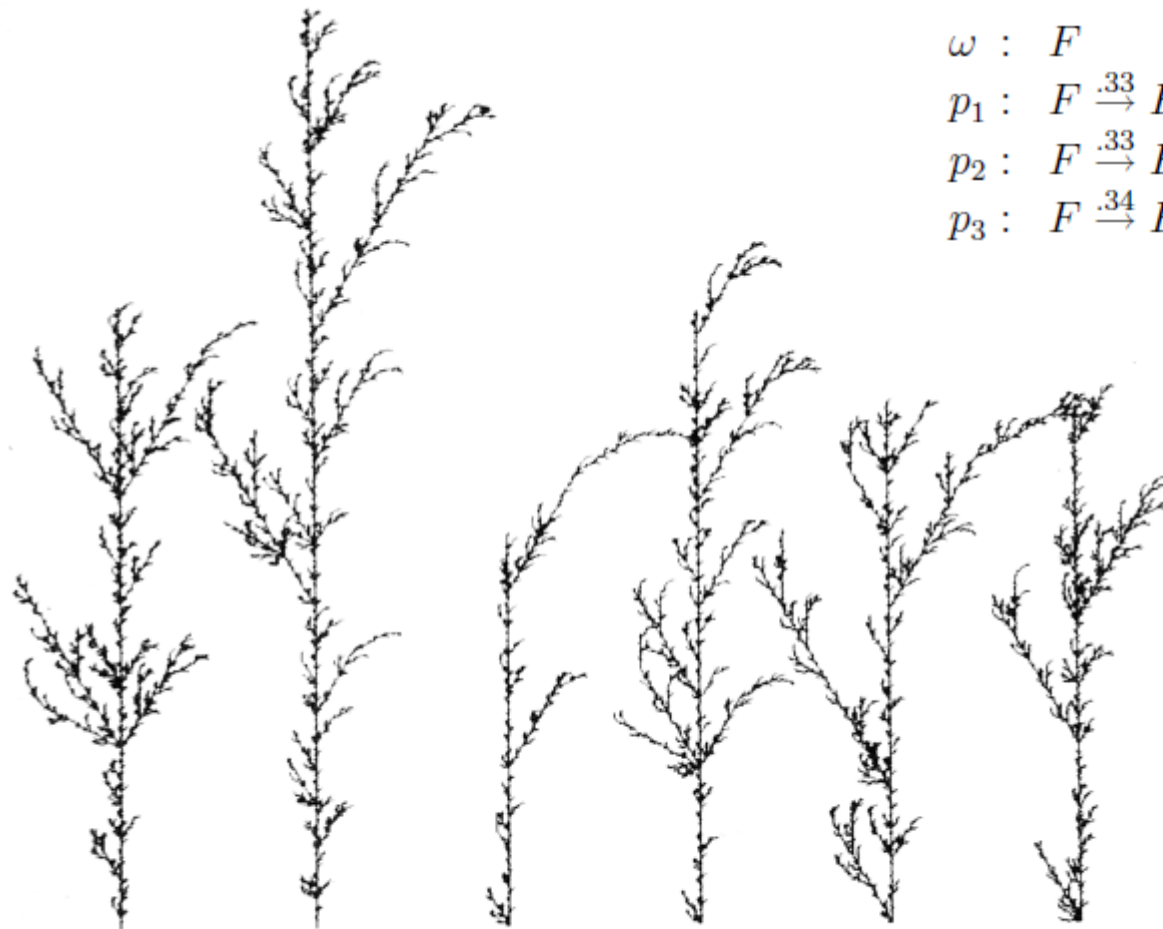
e
 $n=7, \delta=25.7^\circ$
 X
 $X \rightarrow F[+X][-X]FX$
 $F \rightarrow FF$



f
 $n=5, \delta=22.5^\circ$
 X
 $X \rightarrow F-[[X]+X]+F[+FX]-X$
 $F \rightarrow FF$

Figure 1.24: Examples of plant-like structures generated by bracketed OL-systems. L-systems (a), (b) and (c) are edge-rewriting, while (d), (e) and (f) are node-rewriting.

L-system for Plants (stochastic)



$$\begin{aligned}\omega &: F \\ p_1 &: F \xrightarrow{.33} F[+F]F[-F]F \\ p_2 &: F \xrightarrow{.33} F[+F]F \\ p_3 &: F \xrightarrow{.34} F[-F]F\end{aligned}$$

Figure 1.27: Stochastic branching structures



L-system for Plants (3D)



$n=5, \delta=18^\circ$

```

 $\omega$  : plant
 $p_1$  : plant  $\rightarrow$  internode + [ plant + flower ] - - //
      [ - - leaf ] internode [ + + leaf ] -
      [ plant flower ] + + plant flower
 $p_2$  : internode  $\rightarrow$  F seg [ // & & leaf ] [ // ^ ^ leaf ] F seg
 $p_3$  : seg  $\rightarrow$  seg F seg
 $p_4$  : leaf  $\rightarrow$  [ ' { +f-ff-f+ | +f-ff-f } ]
 $p_5$  : flower  $\rightarrow$  [ & & & pedicel ' / wedge // // wedge // //
      wedge // // wedge // // wedge ]
 $p_6$  : pedicel  $\rightarrow$  FF
 $p_7$  : wedge  $\rightarrow$  [ ' ^ F ] [ { & & & -f+f | -f+f } ]
  
```

Figure 1.26: A plant generated by an L-system



Figure 1.28: Flower field



Recent Result

- Growing Demo (Houdini)
 - <https://www.youtube.com/watch?v=-e39SktwmkU>
- SIGGRAPH Asia 2020
 - <https://www.youtube.com/watch?v=MU9E7xJzVGs>



Shape Grammar

- Is used to generate geometric models from a set of shapes and rules

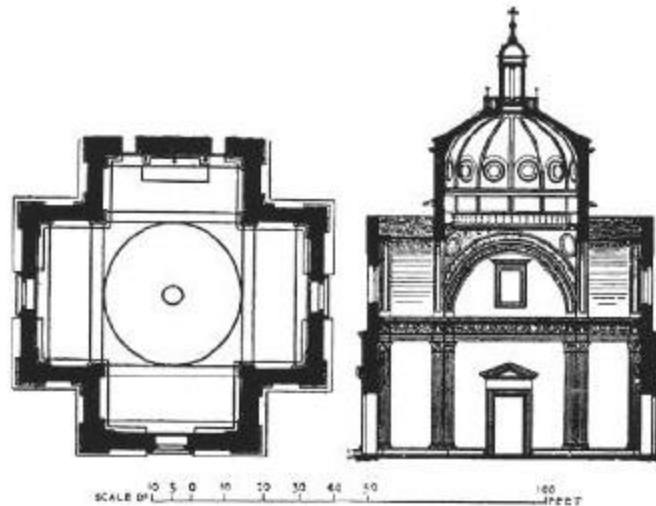


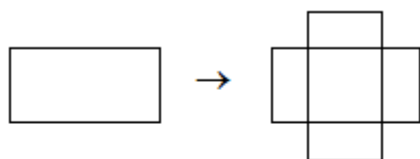
Illustration by Peter Murray, "the Architecture of the Italian Renaissance", Shoken Books Inc. 1963, Pp.96.

Shape Grammar



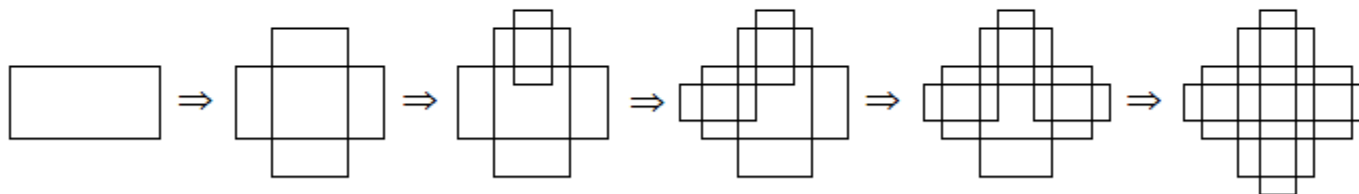


Shape Grammar



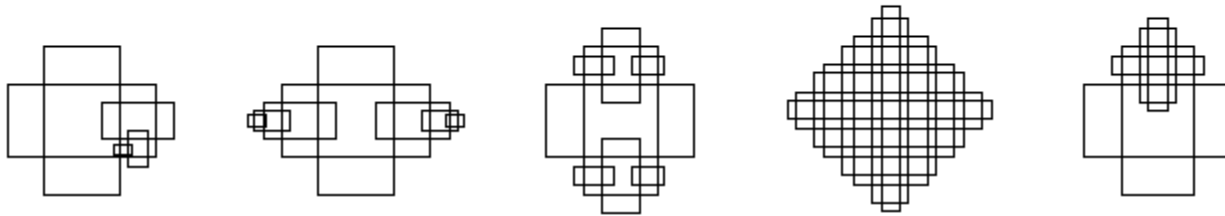
rule

DERIVATION





Shape Grammar



OTHER DESIGNS IN THE LANGUAGE

Exercise: let's make some art!



- What is a shape grammar that makes this?



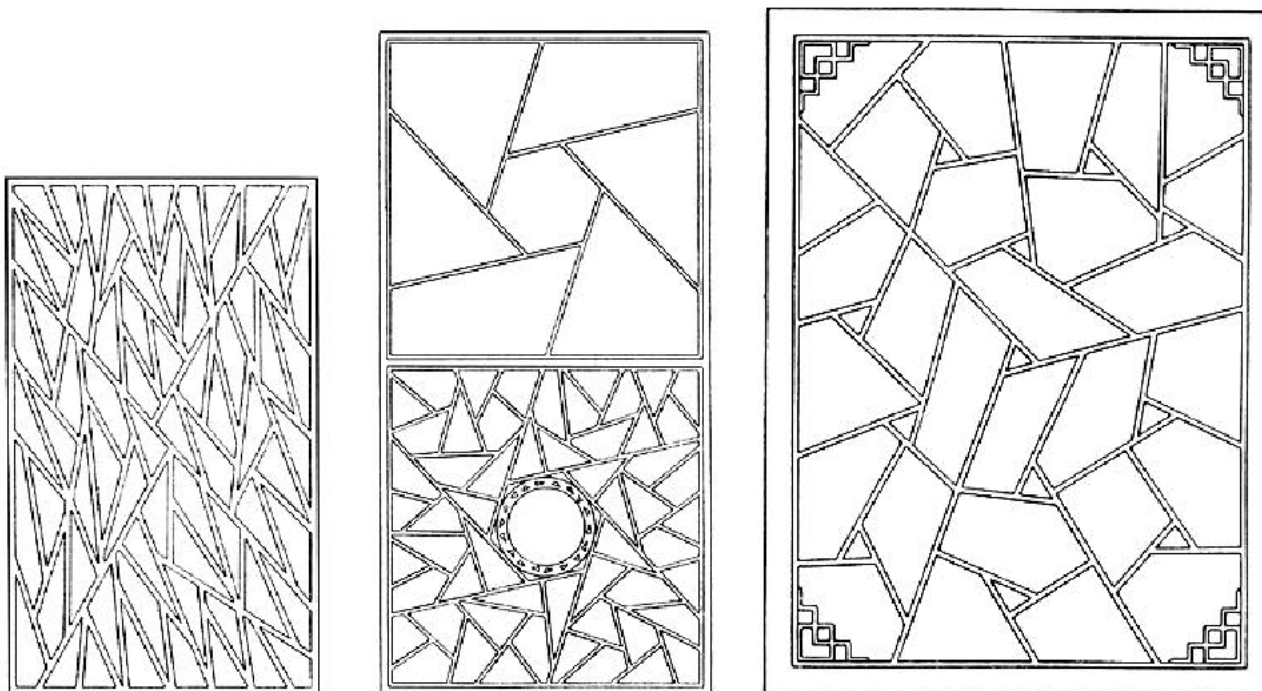
Exercise: let's make some art!



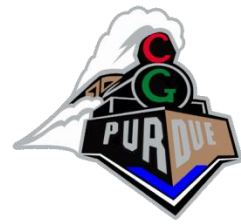
- Consult with your neighbor(s)
- What is the shape grammar that makes the art of the previous slide?
- Go!



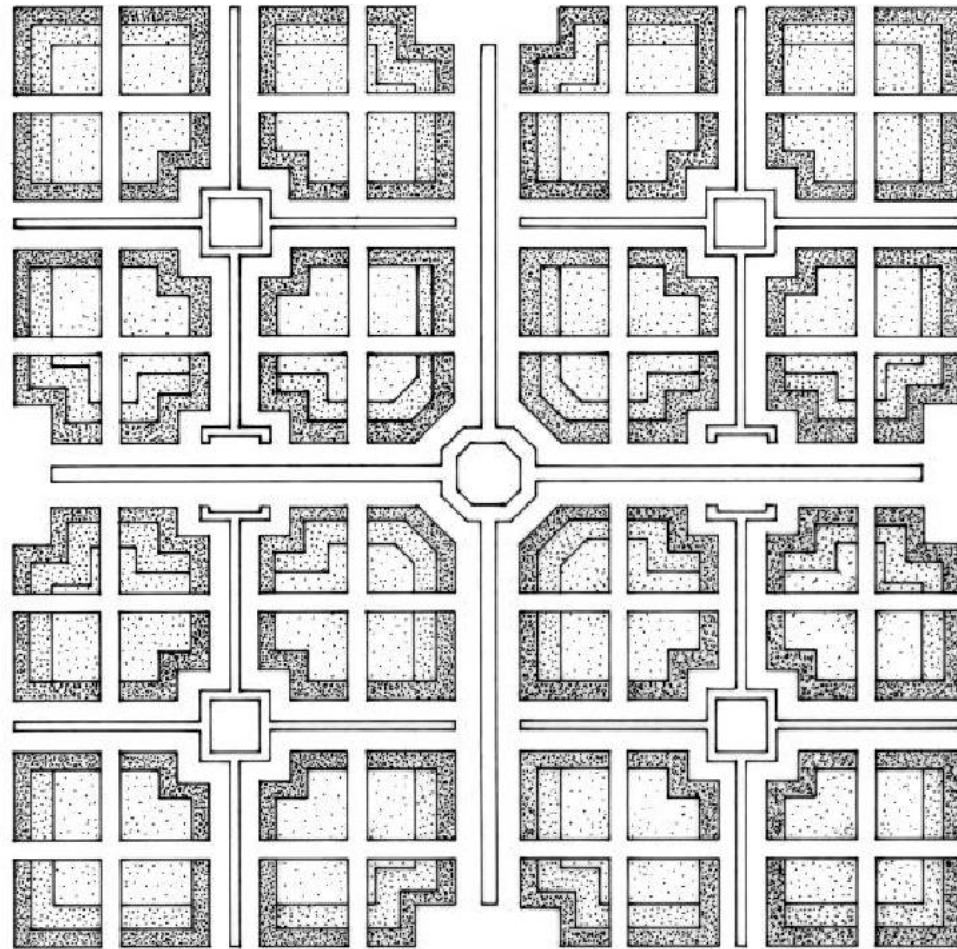
Shape Grammar



Ice-ray grammar



Shape Grammar



Mughul garden grammar



Shape Grammar

- Style: Mediterranean



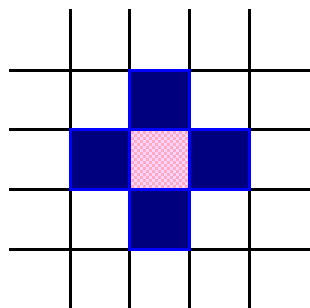


Cellular Automata

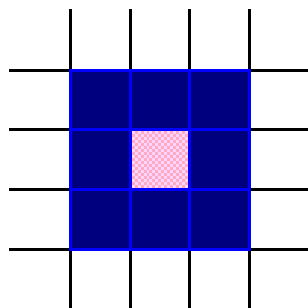
- A cellular automata (CA) is a spatial lattice of N cells, each of which is one of k states at time t .
- Each cell follows the same simple rule for updating its state.
- The cell's state s at time $t+1$ depends on its own state and the states of some number of neighbouring cells at t .
- For one-dimensional CAs, the neighbourhood of a cell consists of the cell itself and r neighbours on either side. Hence, k and r are the parameters of the CA.
- CAs are often described as discrete dynamical systems with the capability to model various kinds of natural discrete or continuous dynamical systems



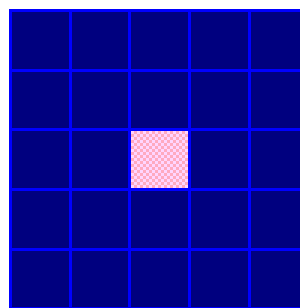
Types of Neighborhoods



von Neumann
neighbourhood



Moore
Neighbourhood



Extended Moore
Neighbourhood

Many more
neighborhood
techniques exist!

Classes of cellular automata (Wolfram)

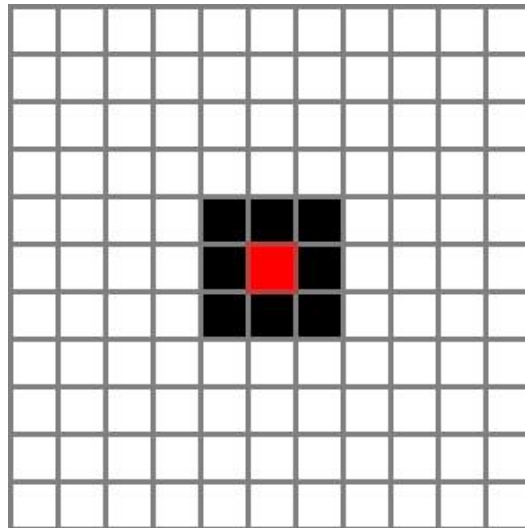


- Class 1: after a finite number of time steps, the CA tends to achieve a unique state from nearly all possible starting conditions (limit points)
- Class 2: the CA creates patterns that repeat periodically or are stable (limit cycles) – probably equivalent to a regular grammar/finite state automaton
- Class 3: from nearly all starting conditions, the CA leads to aperiodic-chaotic patterns, where the statistical properties of these patterns are almost identical (after a sufficient period of time) to the starting patterns (self-similar fractal curves) – computes ‘irregular problems’
- Class 4: after a finite number of steps, the CA usually dies, but there are a few stable (periodic) patterns possible (e.g. Game of Life) - Class 4 CA are believed to be capable of universal computation

John Conway's Game of Life



- 2D cellular automata system.
- Each cell has 8 neighbors - 4 adjacent orthogonally, 4 adjacent diagonally.
- This is the Moore Neighborhood.



John Conway's Game of Life

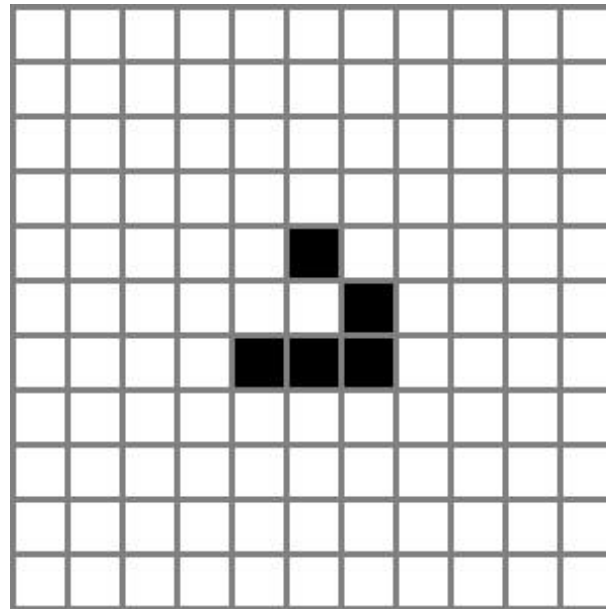


- A live cell with 2 or 3 live neighbors survives to the next round.
- A live cell with 4 or more neighbors dies of overpopulation.
- A live cell with 1 or 0 neighbors dies of isolation.
- An empty cell with exactly 3 neighbors becomes a live cell in the next round.



Is it alive?

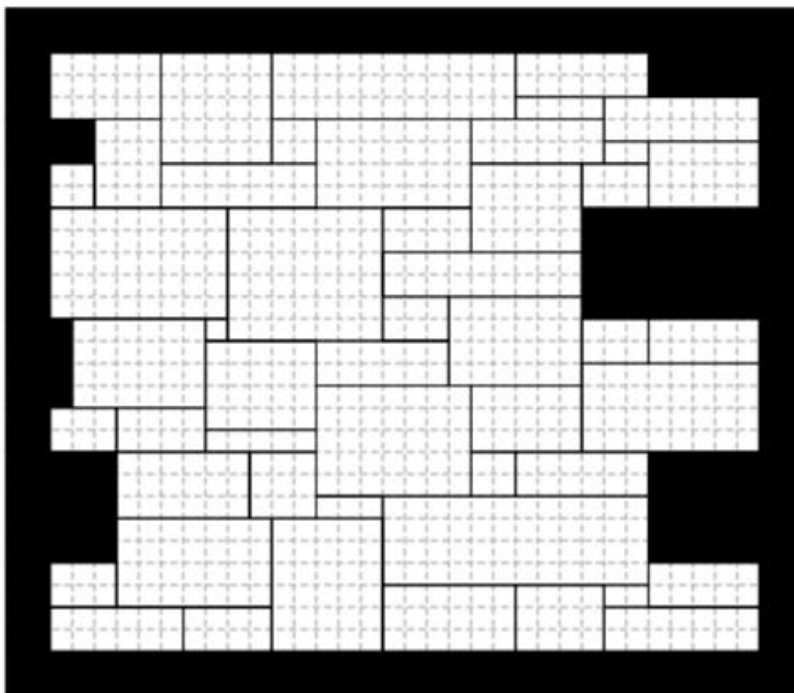
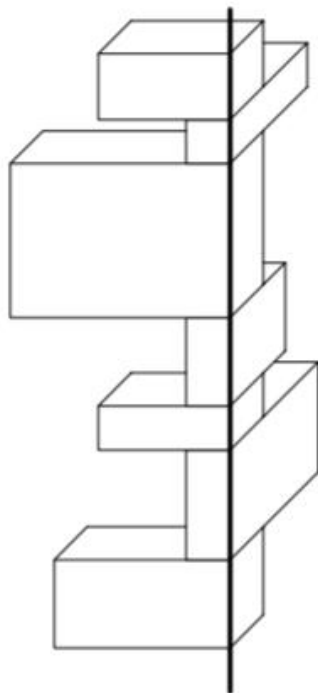
- <http://www.bitstorm.org/gameoflife/>
- Compare it to the definitions...

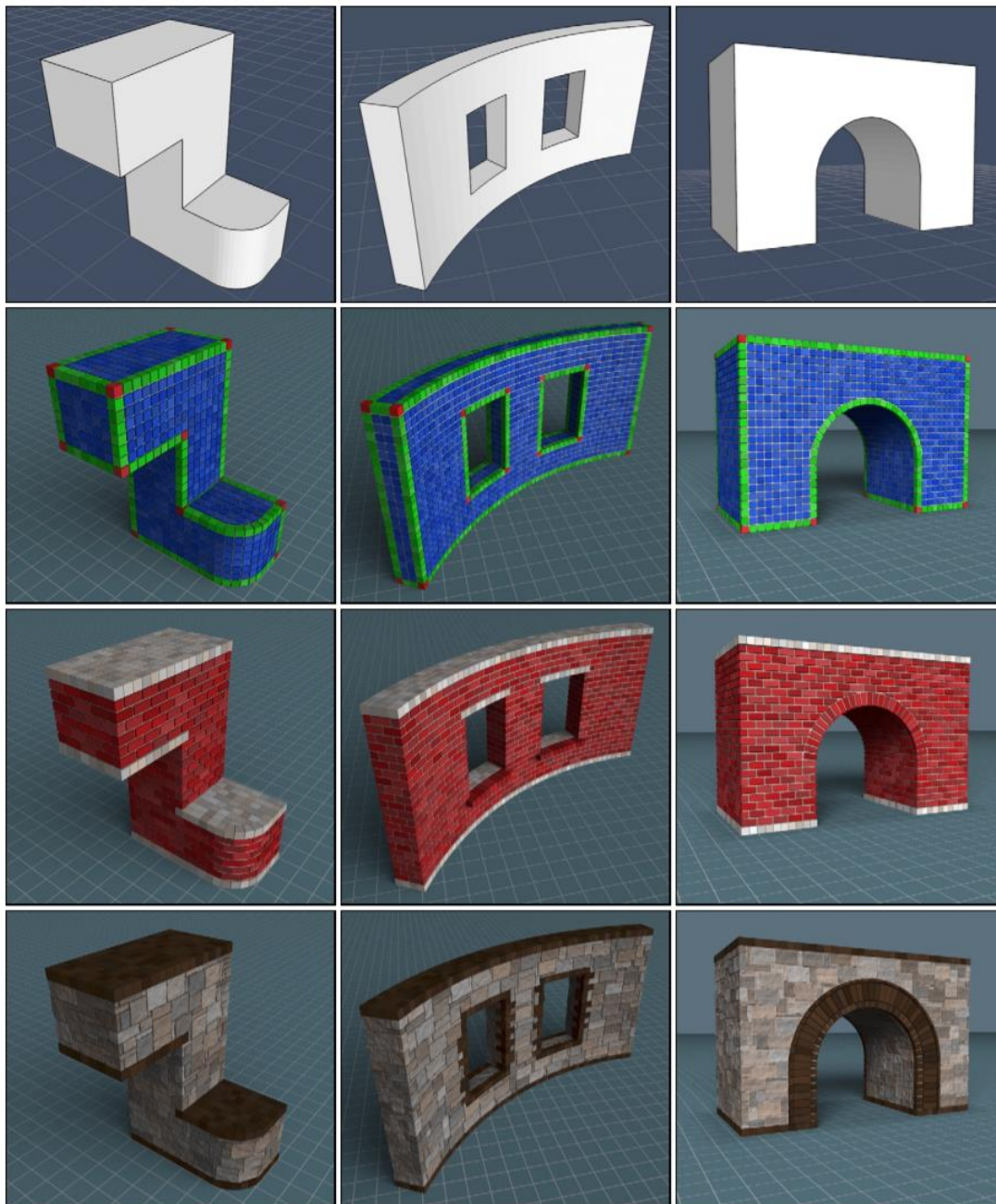




Cellular Automata

- Used in computer graphics:
 - [Cellular Texturing](#)





Urban Procedural Modeling



- Seminal paper:
 - [“Procedural Modeling of Cities”](#), Parish and Mueller, SIGGRAPH 2001

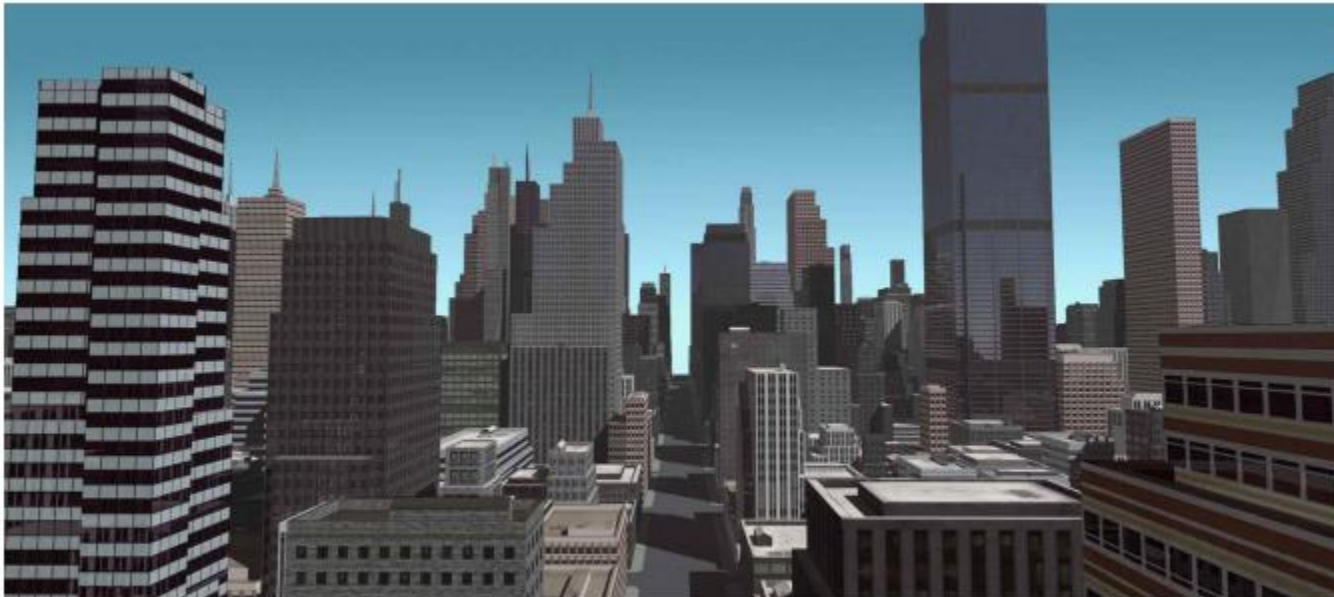


Figure 18. Somewhere in a virtual Manhattan.



Split Grammars

Instant Architecture

Peter Wonka^{*,†}

Michael Wimmer[†]

François Sillion[‡]

William Ribarsky^{*}

^{*}Georgia Institute of Technology [†]Vienna University of Technology [‡]INRIA



Figure 1: Left: This image shows several buildings generated with split grammars, a modeling tool introduced in this paper. Right: The terminal shapes of the grammar are rendered as little boxes. A scene of this complexity can be automatically generated within a few seconds.



Split Grammars

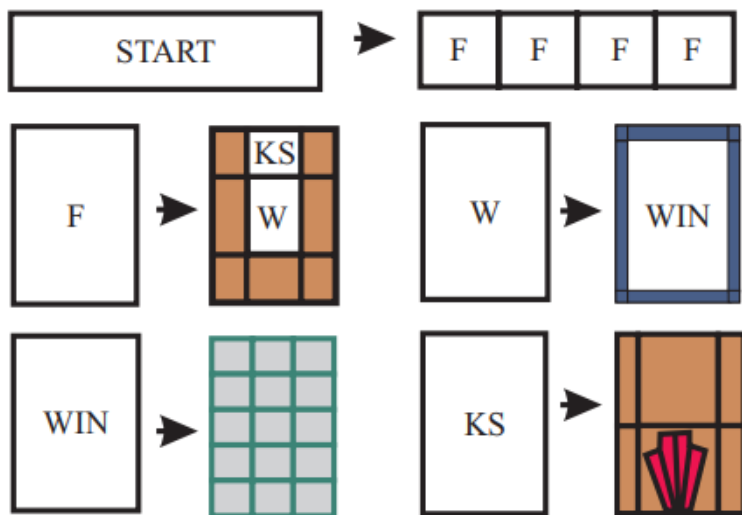


Figure 5: The rules for a simple example split grammar. The white areas (which contain symbols) represent the non-terminal shapes, colored elements are the terminal shapes of the split grammar. The start symbol is split into 4 façade elements, which are further split into a window element, a keystone element and some wall elements etc.

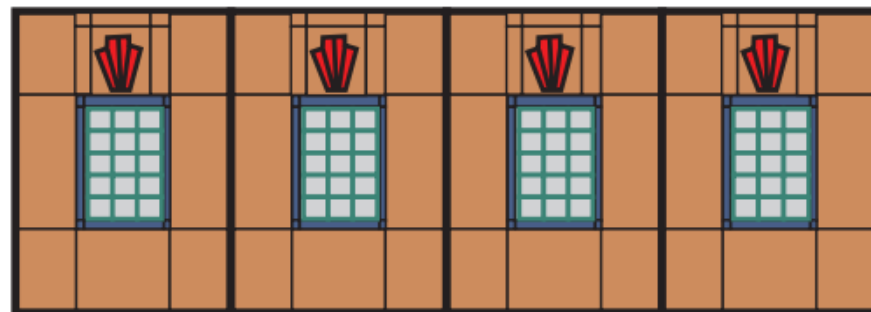
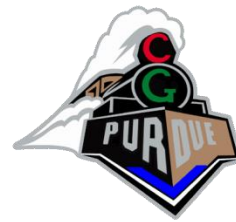
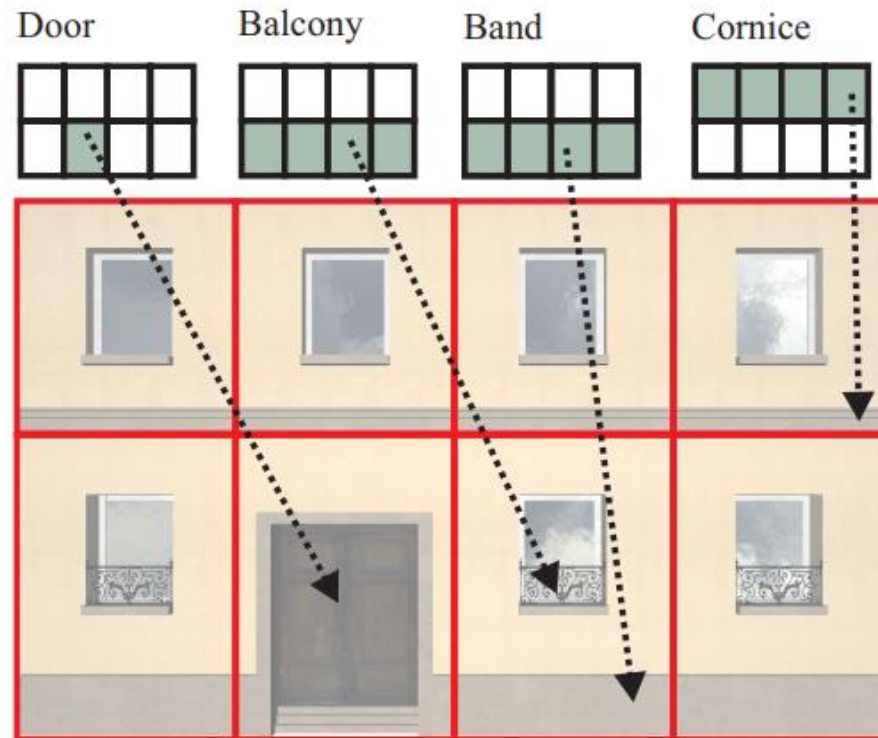


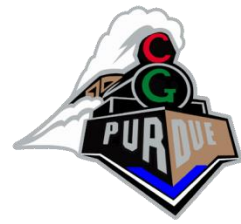
Figure 6: This figure shows the result of the derivation of the grammar in Figure 5.



Split Grammars

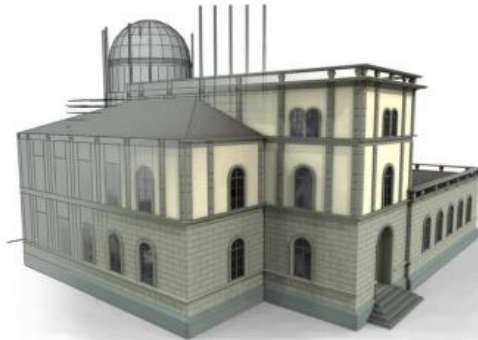


```
FACADE_CONTROL :- DOOR_PATTERN, RANDOM_PATTERN,  
                  RANDOM_PATTERN, RANDOM_PATTERN  
RANDOM_PATTERN  :- CORNICE | BAND | BALCONY  
                  | QUOIN | PILASTER  
DOOR_PATTERN   :- DOOR | GARAGE  
DOOR           :- <[0,1], door, 1> | <[0,2], door, 1>  
                  | <[0,MAX], door, 1>
```



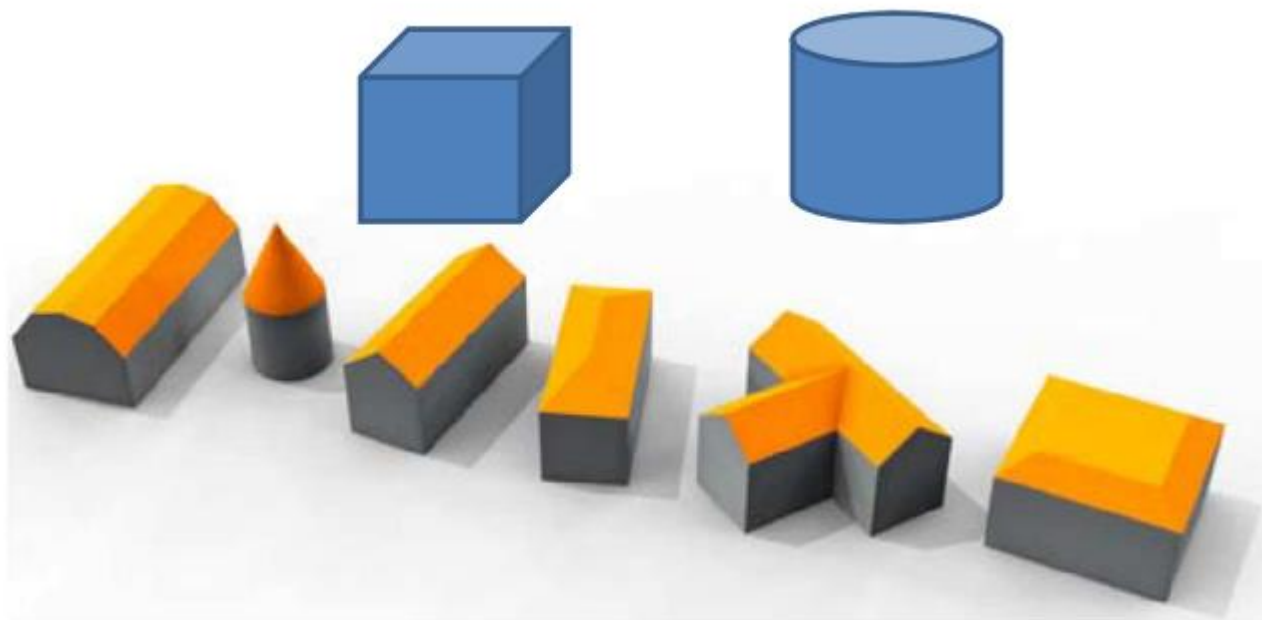
CGA Shape Grammar

- P. Müller, P. Wonka, S. Haegler, A. Ulmer, L. Van Gool: Procedural modeling of buildings SIGGRAPH 2006





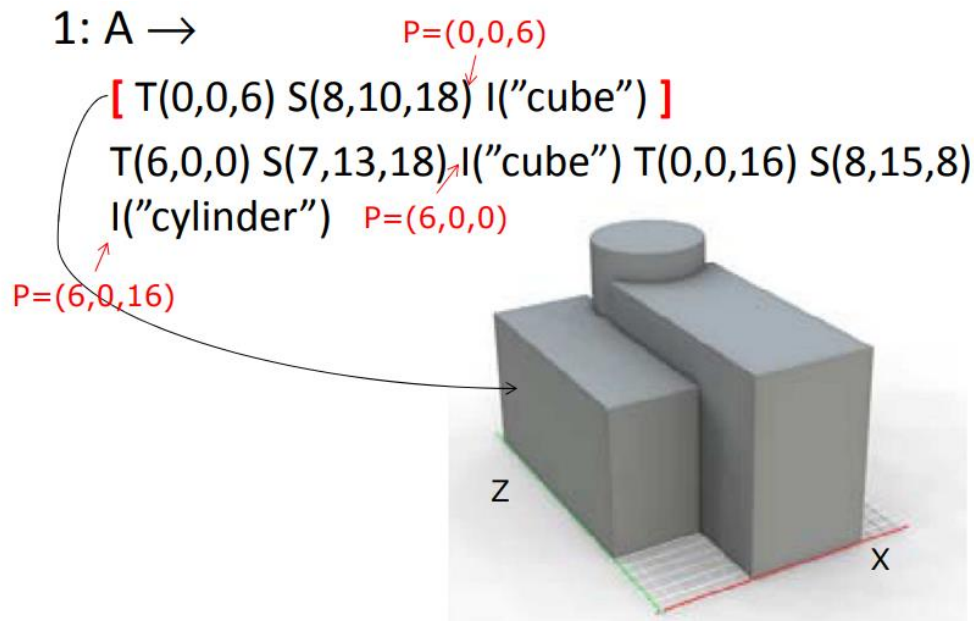
Basic Shapes





Rules and Operations

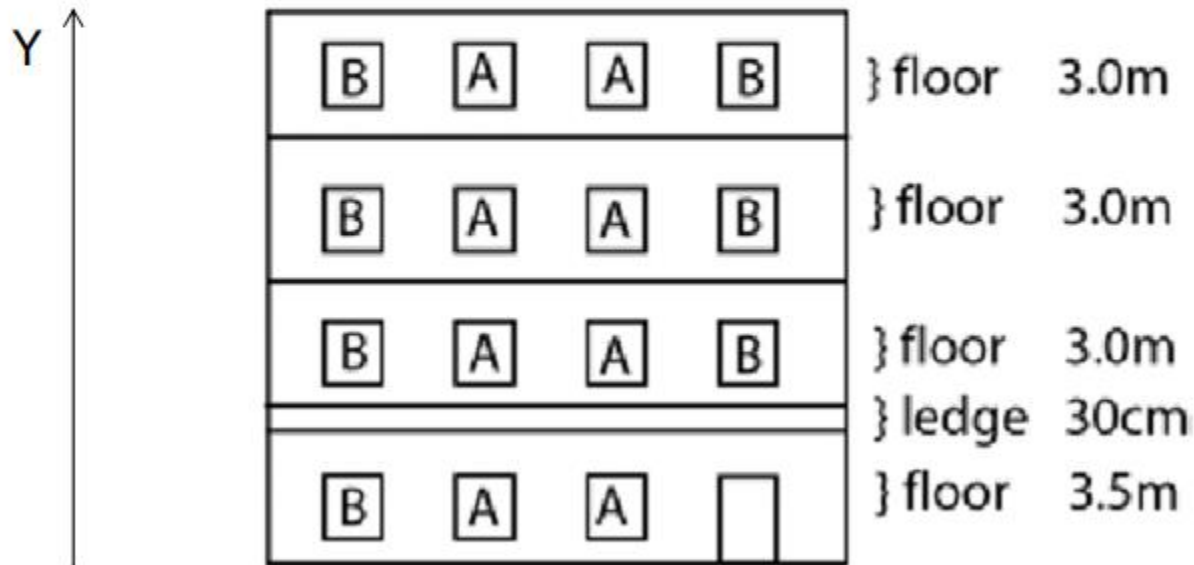
- $T(x,y,z)$ = translate by $[x \ y \ z]$
- $S(a,b,c)$ = scale by $[a \ b \ c]$
- Context (like $[]$ in L-systems) =





Subdivision

1: fac \rightsquigarrow Subdiv("Y",3.5,0.3,3,3,3){ floor | ledge | floor | floor | floor }



Examples



PRIORITY 1:

- 1: lot \rightsquigarrow S(1r, *building_height*, 1r)
Subdiv("Z", Scope.sz*rand(0.3,0.5), 1r){ facades | sidewings }
- 2: sidewings \rightsquigarrow
Subdiv("X", Scope.sx*rand(0.2,0.6), 1r){ siding | ϵ }
Subdiv("X", 1r, Scope.sx*rand(0.2,0.6)){ ϵ | siding }
- 3: siding
 \rightsquigarrow S(1r, 1r, Scope.sz*rand(0.4,1.0)) facades : 0.5
 \rightsquigarrow S(1r, Scope.sy*rand(0.2,0.9), Scope.sz*rand(0.4,1.0))
facades : 0.3
 \rightsquigarrow ϵ : 0.2
- 4: facades \rightsquigarrow Comp("sidefaces"){ facade }

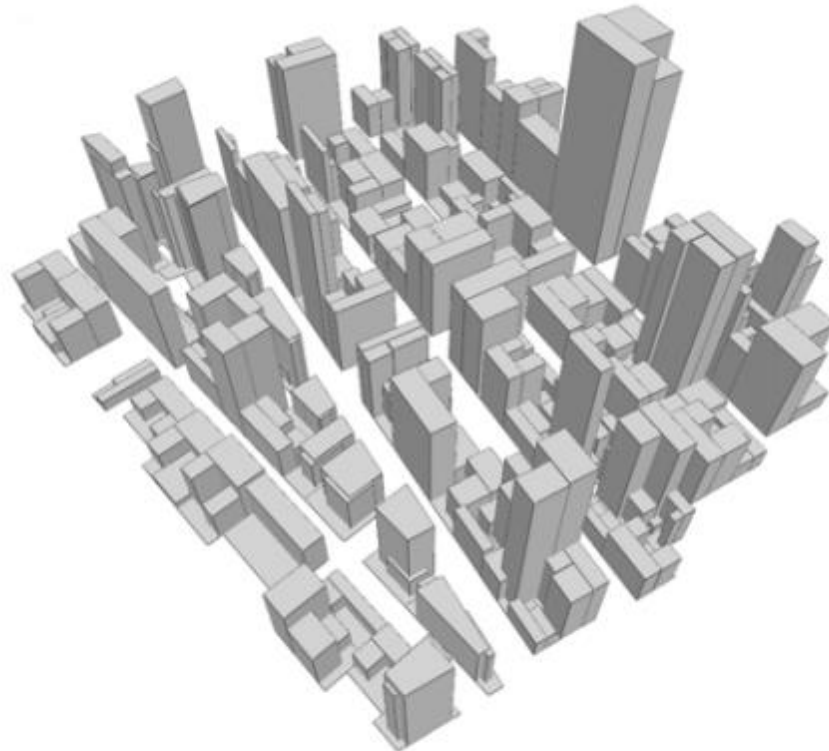


Figure 14: Stochastic variations of building mass models generated with only four rules (starting with the building lot as axiom).

Examples



PRIORITY 2:

- ```
5: facade : Shape.visible("Street") == 0 ~>
 Subdiv("Y",ground_floor_height,1r,top_floor_height)
 { groundfloor | floors | topfloors } firescape
6: groundfloor ~> Subdiv("X",1r,entrance_width,1r){ groundtiles |
 entrance SnapLines("Y","entrancesnap") | groundtiles }
```

PRIORITY 3:

- ```
7: facade ~> floors
8: floors ~> Repeat("YS",floor_height){ floor Snap("XZ") }
9: floor ~> Repeat("XS",tile_width){ tile Snap("Y","tilesnap") }
```

...

- ```
15: wall : Shape.visible("Street") ~> I("frontwall.obj")
```

PRIORITY 4:

- ```
16: firescape ~> Subdiv("XS",1r,2*tile_width,7r,"tilesnap")
  { epsilon | escapestairs | ε }
17: escapestairs ~> S(1r,1r,firescape_depth)
  T(0,0,-firescape_depth) Subdiv("YS",ground_floor_height,1r)
  { ε | Repeat("YS",floor_height){ I("firescape.obj") } }
```



Figure 15: A procedurally generated building modeled with snap lines. Note the alignment of important lines and planes in the construction.

Urban Procedural Modeling



- Cities
- Buildings
- CityEngine
 - CityEngine
 - <https://www.youtube.com/watch?v=xJCIIIE9pulk>
 - (for Unreal:
<https://www.youtube.com/watch?v=faOdiVcxRG4>)



Videos and more

- Procedural Modeling of Cities
 - <http://www.youtube.com/watch?v=khrWonALQiE>
- Procedural Modeling of Buildings
 - <http://www.youtube.com/watch?v=iDsSrMkW1uc>
- Procedural Modeling of Structurally Sound Masonry Buildings
 - <http://www.youtube.com/watch?v=zXBAthLSxSQ>
- Image-based Procedural Modeling of Facades
 - <http://www.youtube.com/watch?v=SncibzYy0b4>
- Image-based Modeling
 - Facades: http://www.youtube.com/watch?v=amD6_i3MVZM