

# Procedural Modeling

Wojciech Matusik

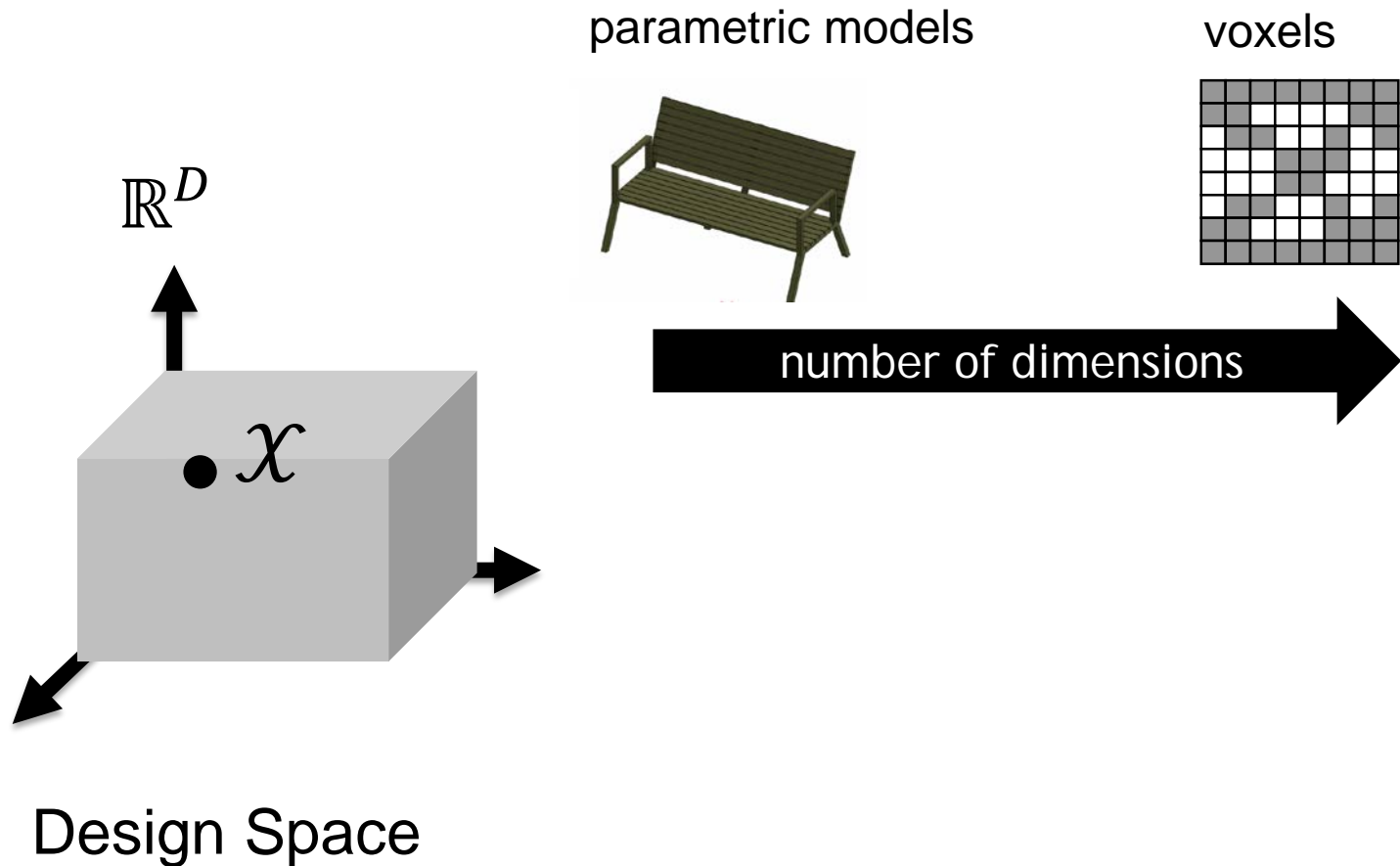
CSAIL & EECS MIT

# Computational Design Stack



# Design Space

- Each design can be mathematically represented as a point in  $\mathbb{R}^D$



# Parametric Design

$$\begin{bmatrix} x_1 \\ x_2 \\ \vdots \\ x_N \end{bmatrix}$$

parameters



**Parametric  
Design**



# Procedural Modeling

- Goal:
  - Describe 3D models algorithmically
- Advantages:
  - Automatic generation
  - Concise representation
  - Parameterized classes of models
  - More general than CAD parametric models
  - Dimensionality of design space might vary

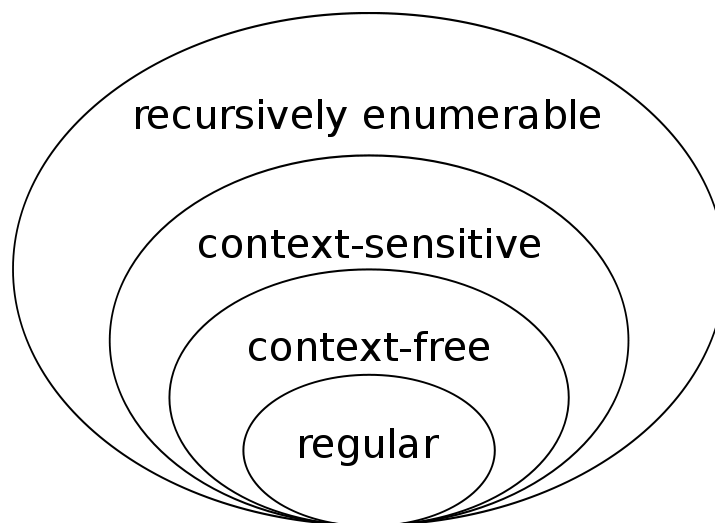
# Formal Grammars and Languages

- A finite set of nonterminal symbols:  $\{S, A, B\}$
  - A finite set of terminal symbols:  $\{a, b\}$
  - A finite set of production rules:  $S \rightarrow AB$
  - A start symbol:  $S$
- 
- Generates a set of finite-length sequences of symbols by recursively applying production rules starting with  $S$

# Formal Grammars and Languages

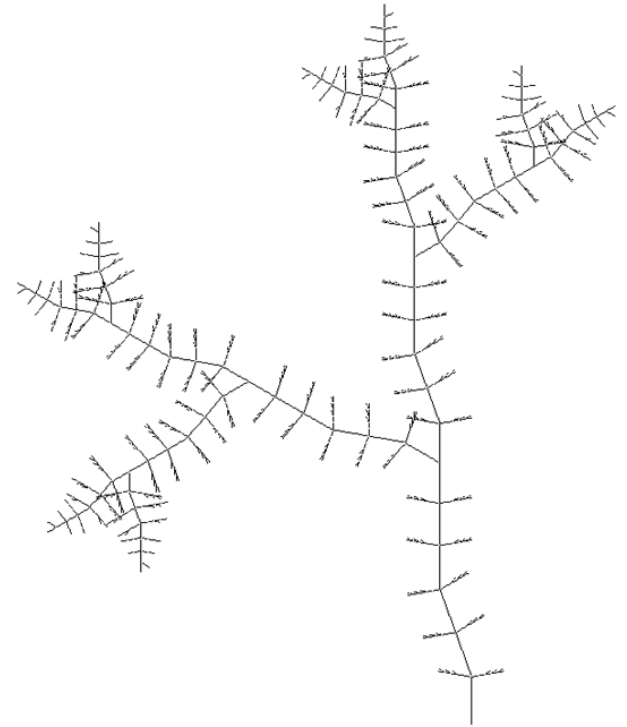
- Chomsky's four types of grammars

Grammar	Languages	Automaton	Production rules (constraints)
Type-0	Recursively enumerable	Turing machine	$\alpha \rightarrow \beta$ (no restrictions)
Type-1	Context-sensitive	Linear-bounded non-deterministic Turing machine	$\alpha A \beta \rightarrow \alpha \gamma \beta$
Type-2	Context-free	Non-deterministic pushdown automaton	$A \rightarrow \gamma$
Type-3	Regular	Finite state automaton	$A \rightarrow a$ and $A \rightarrow aB$



# L-systems (Lindenmayer systems)

- A model of morphogenesis, based on formal grammars (set of rules and symbols)
- Introduced in 1968 by the Swedish biologist A. Lindenmayer
- Originally designed as a formal description of the development of simple multi-cellular organisms
- Later on, extended to describe higher plants and complex branching structures





# L-system Example 1: Algae

- nonterminals : A B
- terminals : none
- start : A
- rules :  $(A \rightarrow AB), (B \rightarrow A)$

$n = 0 : A$

$n = 1 : AB$

$n = 2 : ABA$

$n = 3 : ABAAB$

$n = 4 : ABAABABA$

$n = 5 : ABAABABAABAAB$

# L-system Example 2

- nonterminals : 0, 1
- terminals : [ , ]
- start : 0
- rules :  $(1 \rightarrow 11), (0 \rightarrow 1[0]0)$

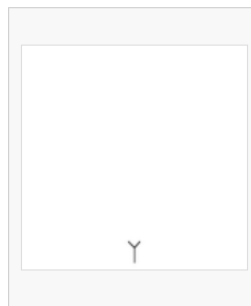
start:	0
1st recursion:	1[0]0
2nd recursion:	11[1[0]0]1[0]0
3rd recursion:	1111[11[1[0]0]1[0]0]11[1[0]0]1[0]0

# L-system Example 2

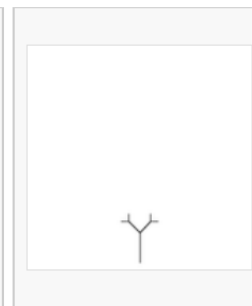
- Visual representation: turtle graphics
  - 0: draw a line segment ending in a leaf
  - 1: draw a line segment
  - [: push position and angle, turn left 45 degrees
  - ]: pop position and angle, turn right 45 degrees



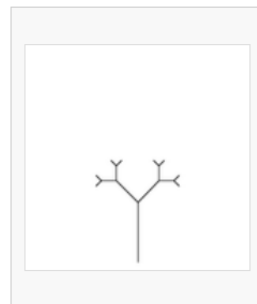
Axiom



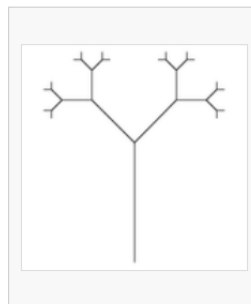
First recursion



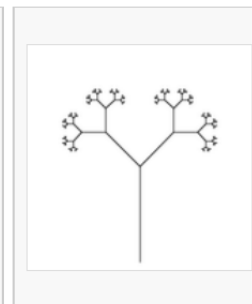
Second recursion



Third recursion



Fourth recursion



Seventh recursion, scaled  
down ten times

# L-system Example 3: Fractal Plant

- nonterminals : X, F
- terminals : + - [ ]
- start : X
- rules :  $(X \rightarrow F - [[X] + X] + F [+FX] - X), (F \rightarrow FF)$



# L-Systems Examples

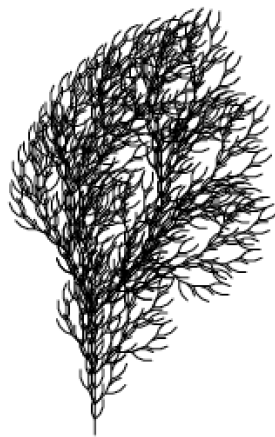
- Tree examples



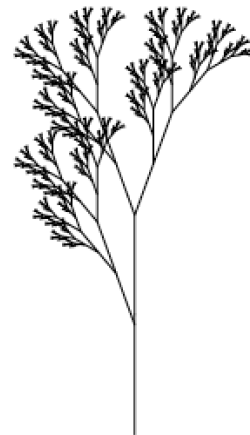
a  
 $n=5, \delta=25.7^\circ$   
 $F$   
 $F \rightarrow F[+F]F[-F]F$



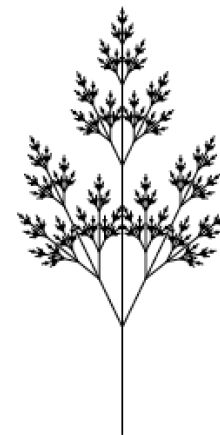
b  
 $n=5, \delta=20^\circ$   
 $F$   
 $F \rightarrow F[+F]F[-F][F]$



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

# L-Systems Examples



# Types of L-Systems

- *Deterministic*: If there is exactly one production for each symbol

$$0 \rightarrow 1[0]0$$

- *Stochastic*: If there are several, and each is chosen with a certain probability during each iteration

$$0 \text{ (0.5)} \rightarrow 1[0]0$$

$$0 \text{ (0.5)} \rightarrow 0$$

# Types of L-Systems

- *Context-free*: production rules refer only to an individual symbol
- *Context-sensitive*: the production rules apply to a particular symbol only if the symbol has certain neighbours

$$S \rightarrow aSBC$$

$$S \rightarrow aBC$$

$$CB \rightarrow HB$$

$$HB \rightarrow HC$$

$$HC \rightarrow BC$$

$$aB \rightarrow ab$$

$$bB \rightarrow bb$$

$$bC \rightarrow bc$$

$$cC \rightarrow cc$$



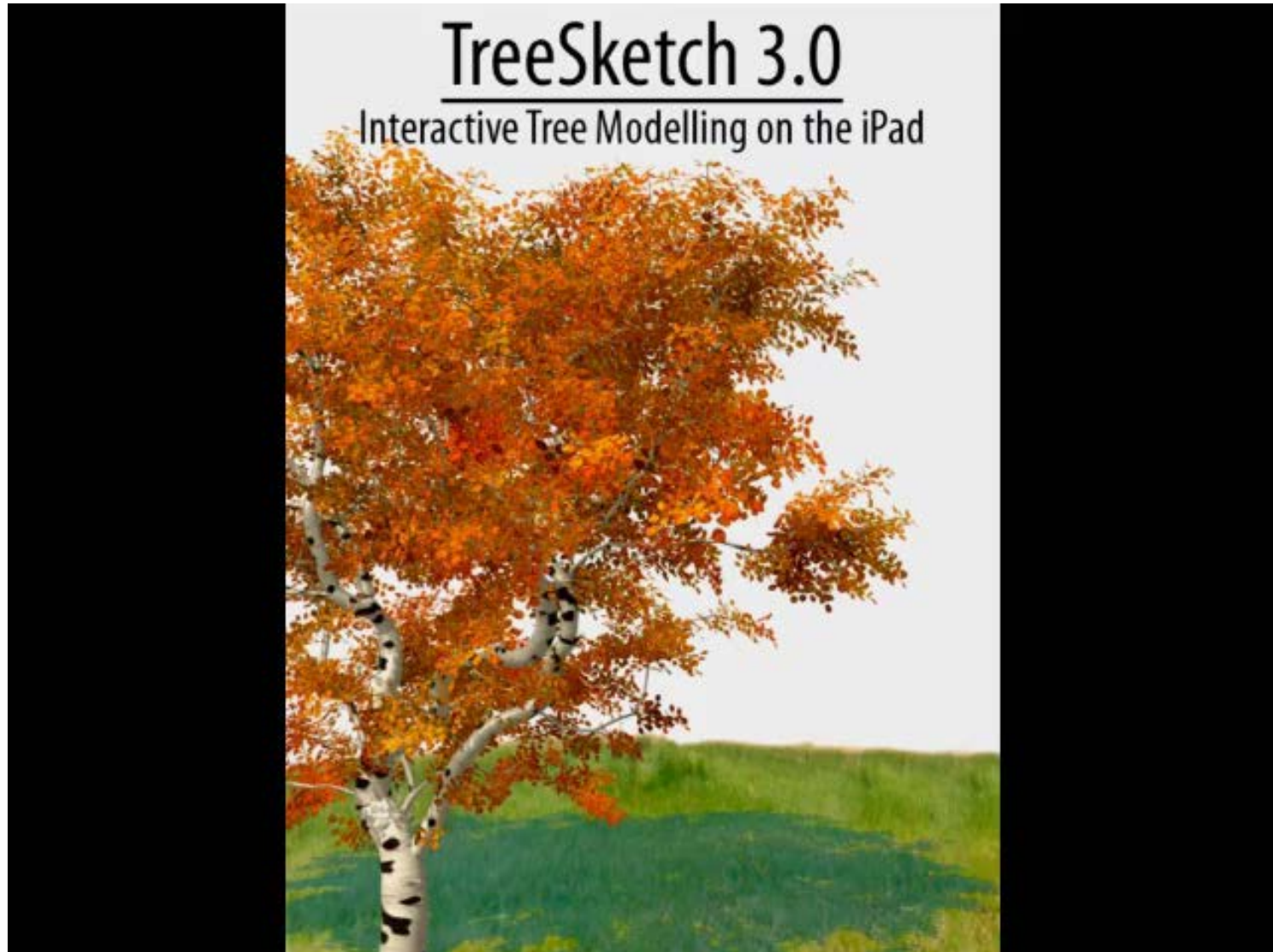
# Types of L-Systems

- *Nonparametric grammars*: no parameters associated with symbols
- *Parametric grammars*: symbols can have parameters
  - Parameters used in conditional rules
  - Production rules modify parameters
  - $A(x,y) : x = 0 \rightarrow A(1, y+1)B(2,3)$

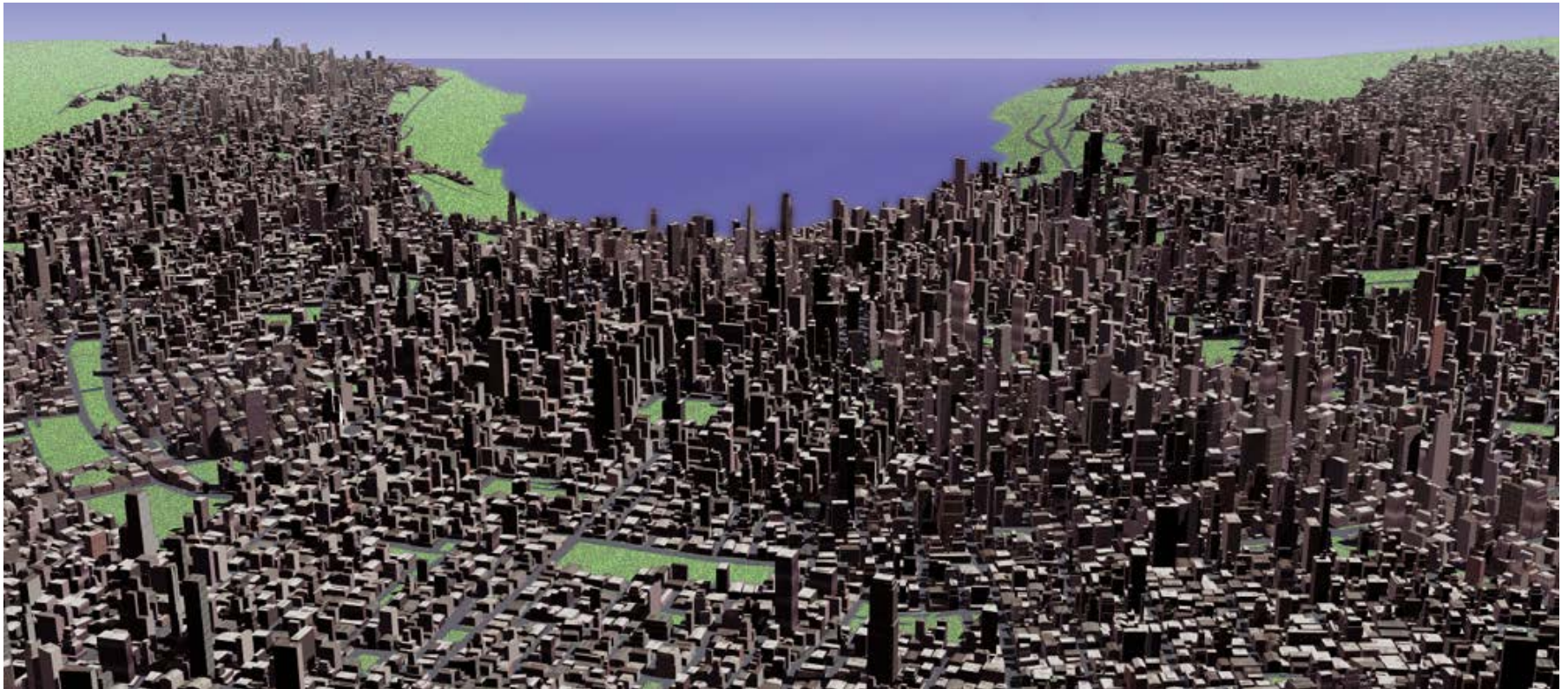
# Applications: Plant Modeling

- Algorithmic Botany @ the University of Calgary
  - Covers many variants of L-Systems, formal derivations, and exhaustive coverage of different plant types.
  - <http://algorithmicbotany.org/papers>
  - [http://algorithmicbotany.org/virtual\\_laboratory/](http://algorithmicbotany.org/virtual_laboratory/)

# TreeSketch: Interactive Tree Modeling

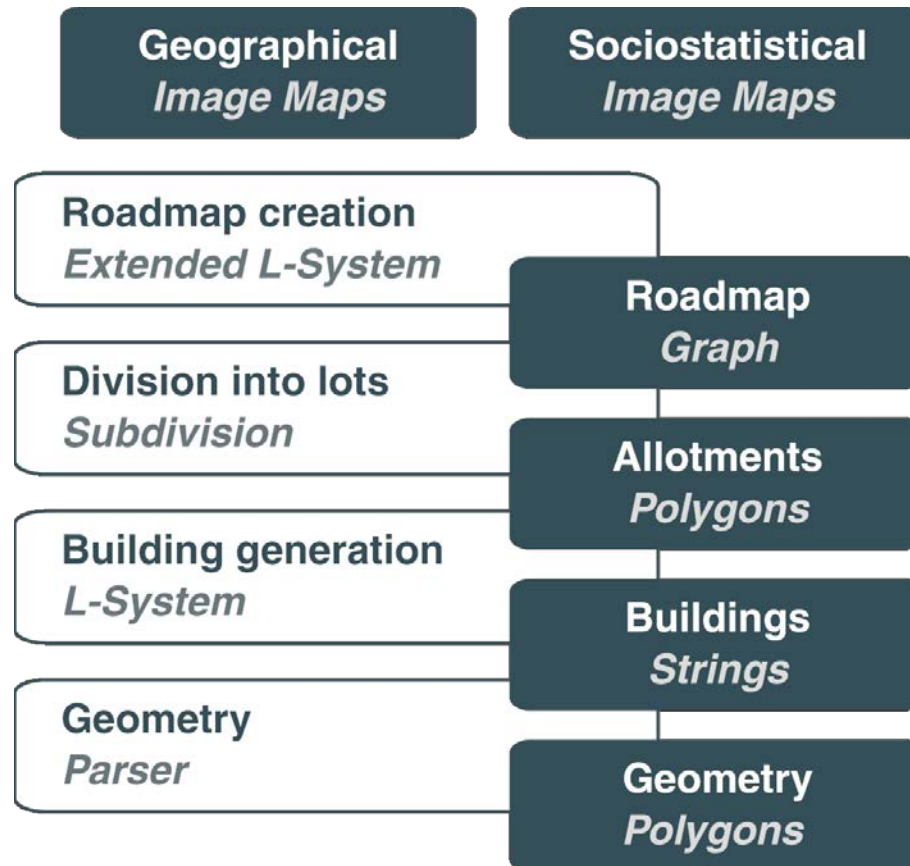


# Procedural Modeling of Cities



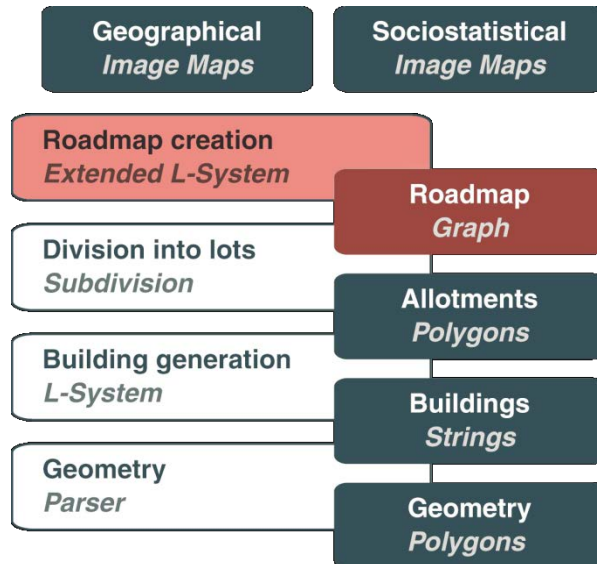
*Procedural Modeling of Cities / Yoav Parish, Pascal Müller, Siggraph 2001*

# System Pipeline

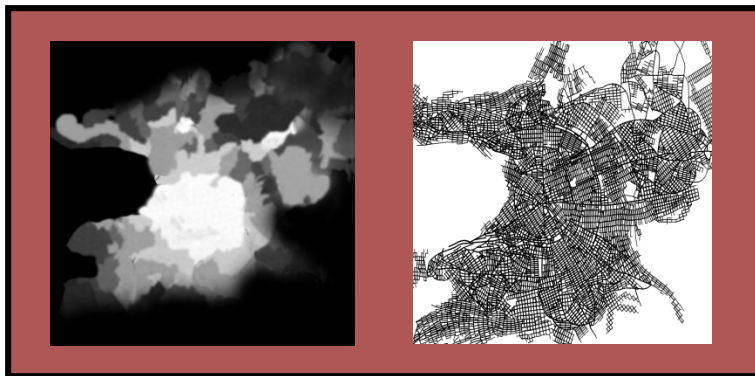




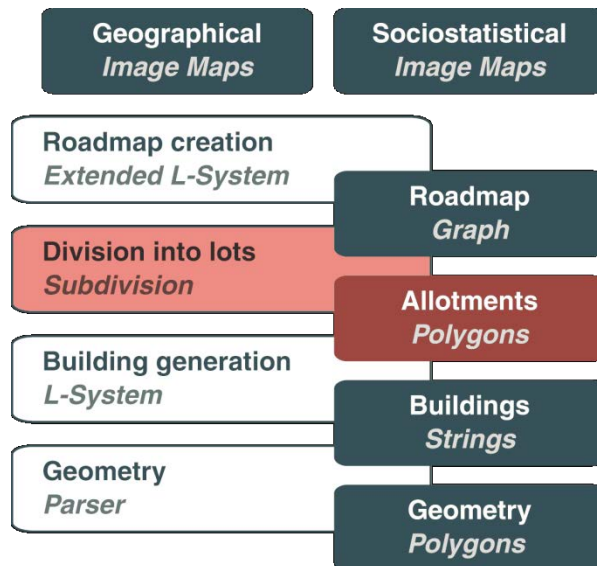
# Module 1: Streetmap Creation



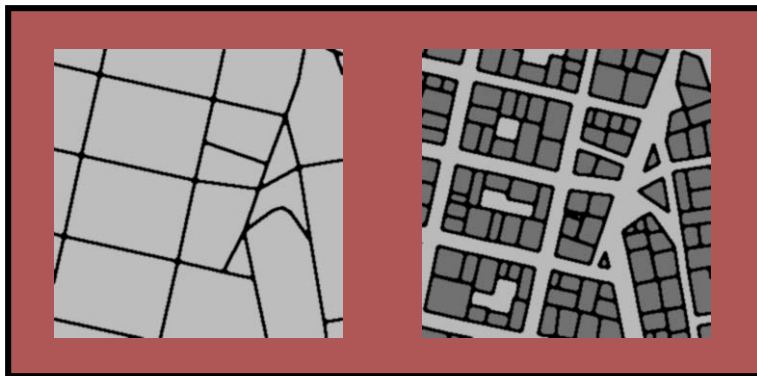
- Input:  
Image maps,  
parameters for rules
- Output:  
A street graph for  
interactive editing



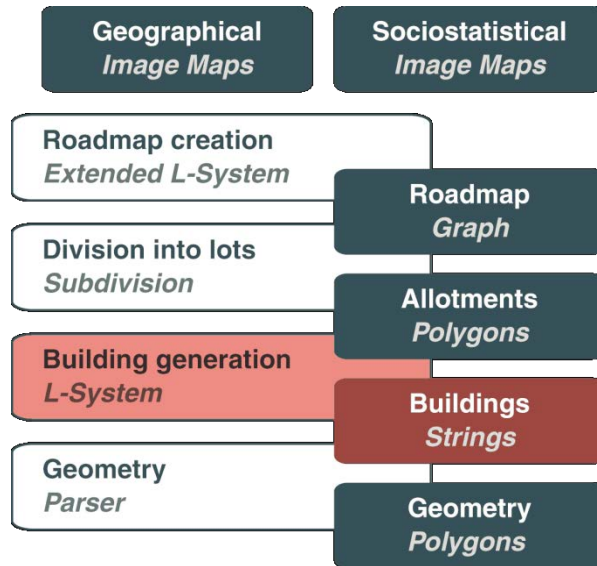
## Module 2: Division into Lots



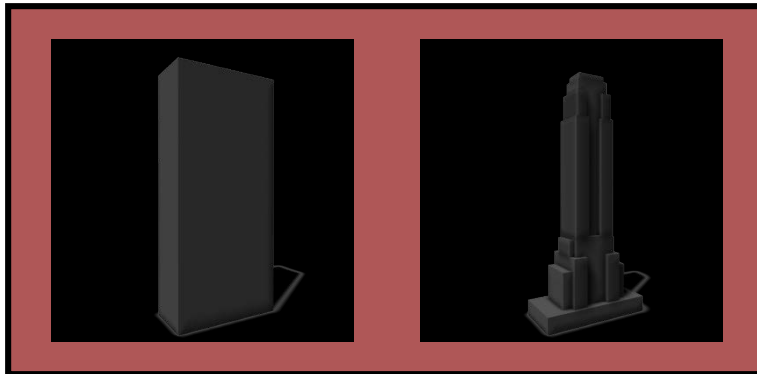
- Input:  
Street graph, area usage map
- Output:  
Polygon set of allotments for buildings



# Module 3: Building Generation

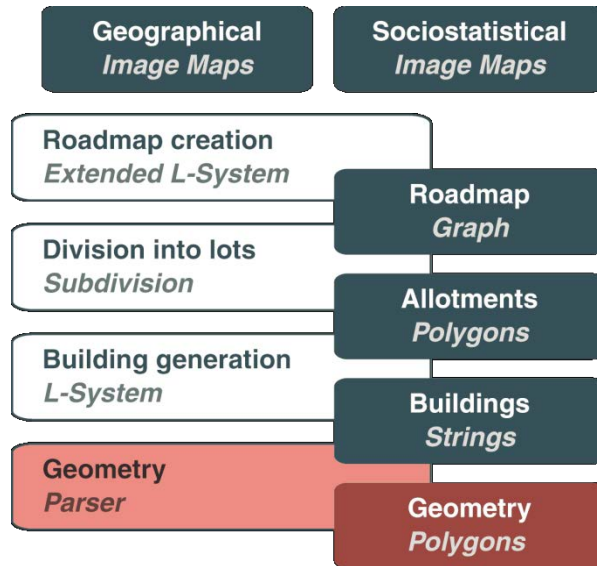


- Input:  
Lot polygons, age map and zone plan
- Output:  
Building strings with additional info

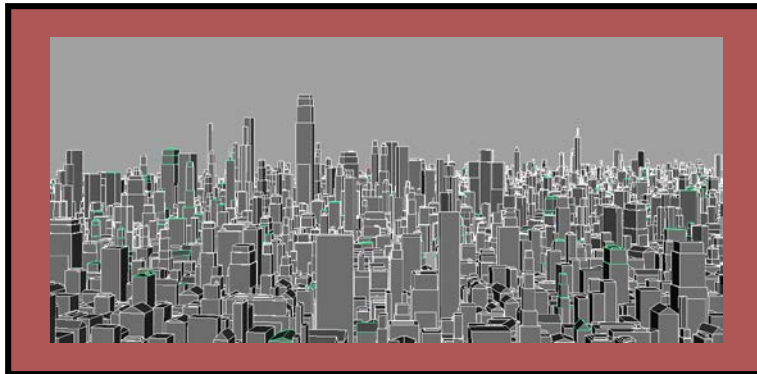




# Module 4: Geometry and Facades



- Input:  
Strings and building type
- Output:  
City geometry and facade texture  
(procedural shader)



# Procedural Modeling of Buildings

- Pompeii





# Procedural Modeling of Buildings

- Modern architecture

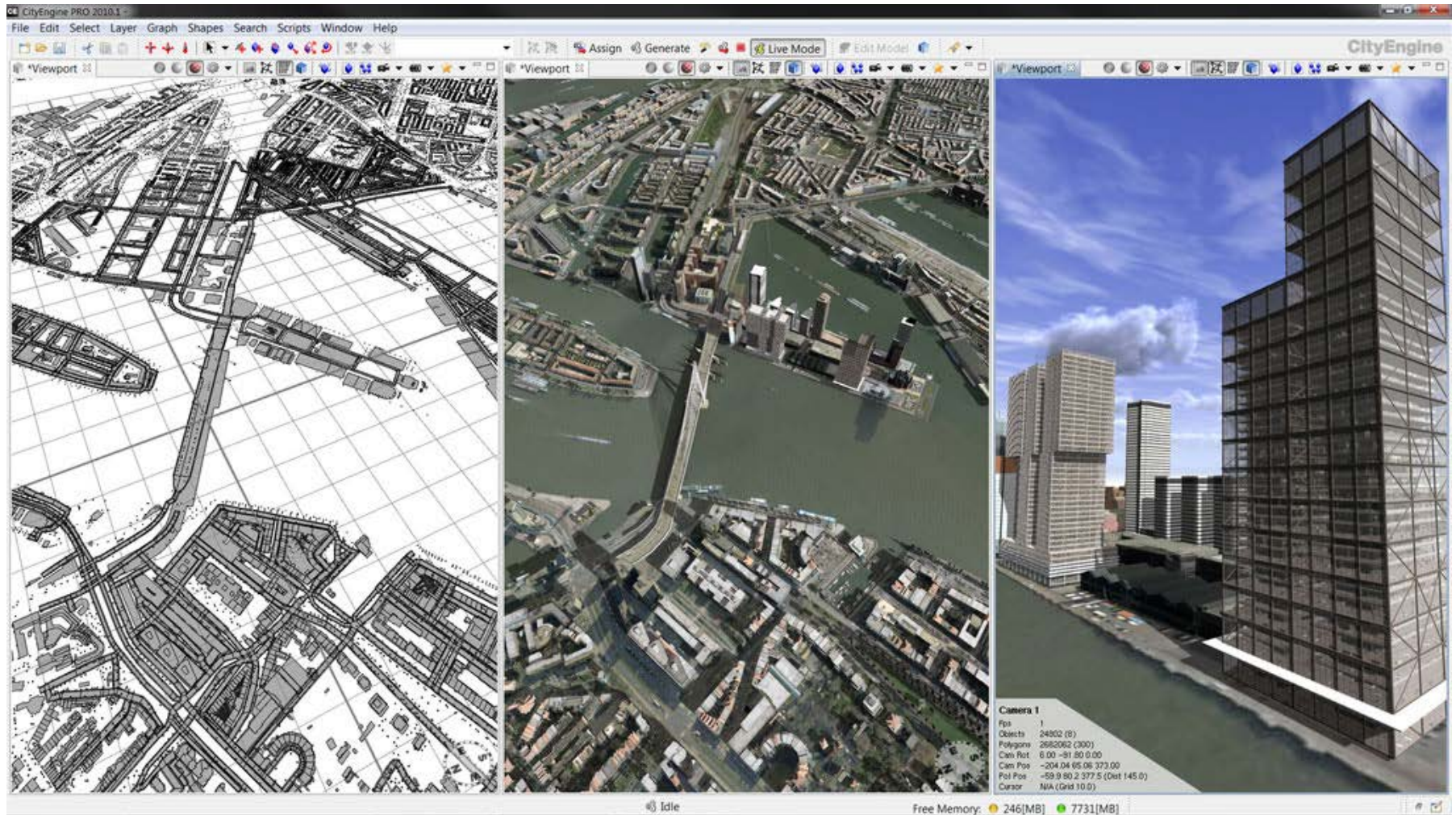


## **Procedural Modeling of Buildings**

Pascal Müller  
Peter Wonka  
Simon Haegler  
Anreas Ulmer  
Luc Van Gool



# CityEngine

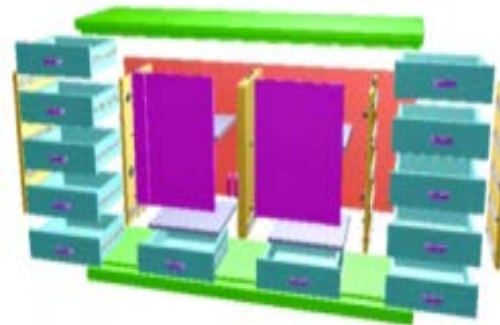
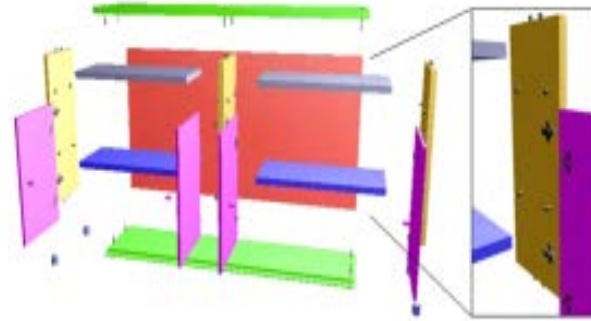


# CityEngine

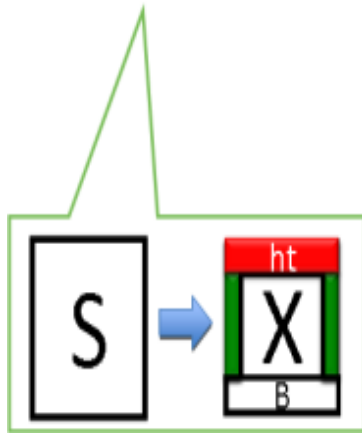
<http://www.youtube.com/watch?v=aFRqSJFp-l0>

<http://www.esri.com/software/cityengine/>

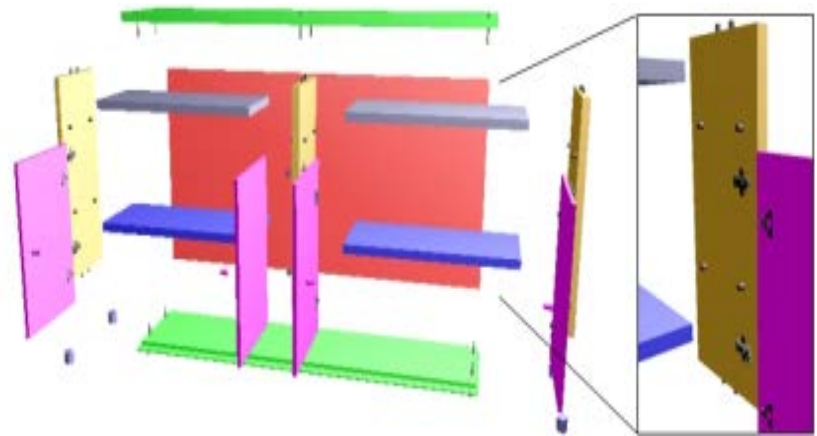
# Furniture Design using Formal Grammar



# Furniture Design using Formal Grammar



Formal  
grammar



Separate parts  
and  
connectors



# Formal Grammar for 2D Cabinets

$$N = \{ \boxed{S}, \boxed{B}, \boxed{X}, \boxed{Y} \}$$

Non-terminal  
Symbols  
- Collection of Parts

$$\Sigma = \{hb, ht, v, ha, leg, wheel\}$$



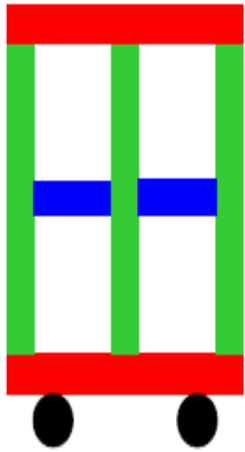
Terminal Symbols  
- Separate Parts

$P$  : Set of Production Rules

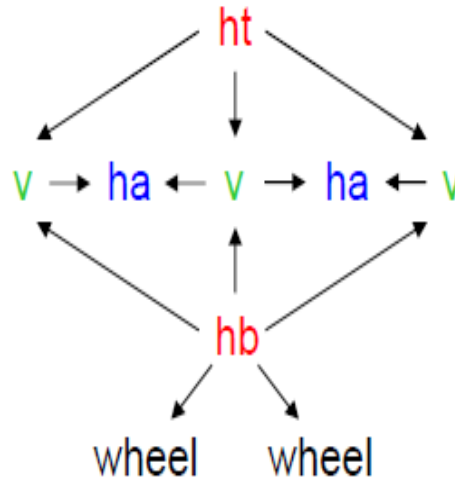
$\boxed{S}$  : Start Symbol

The language specifies a directed graph,  
and each graph represents parts and connectors

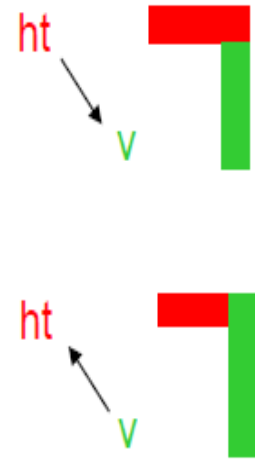
# Representation of 2D Cabinets



Example 2D Cabinet



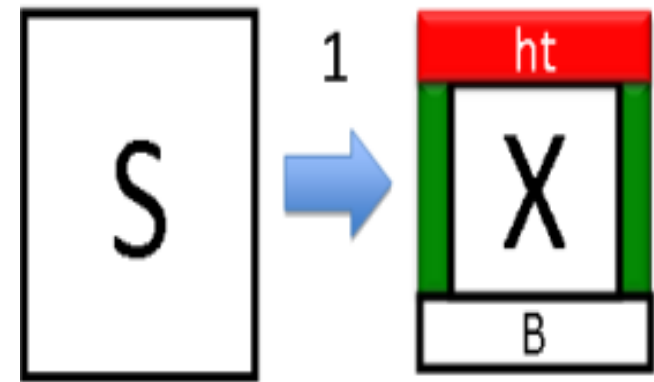
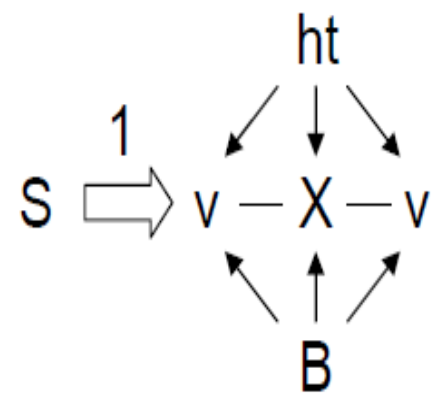
Corresponding Graph



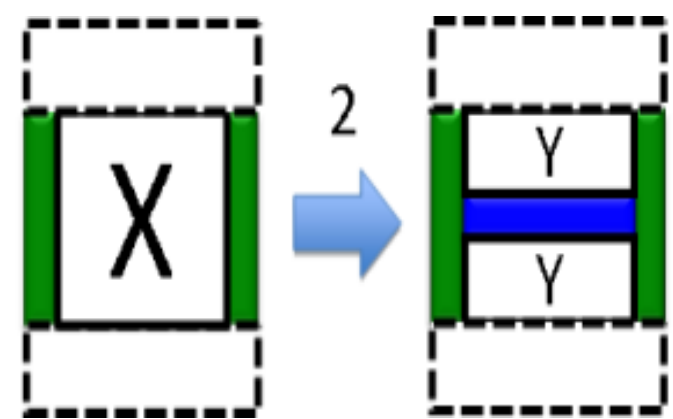
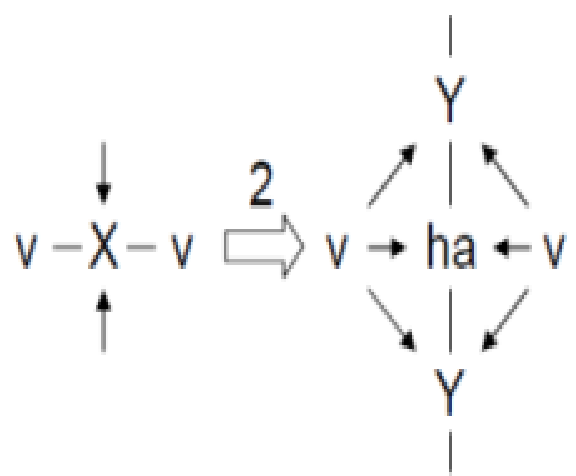
Positioning of Parts

# Examples of Production Rules

Production Rule 1

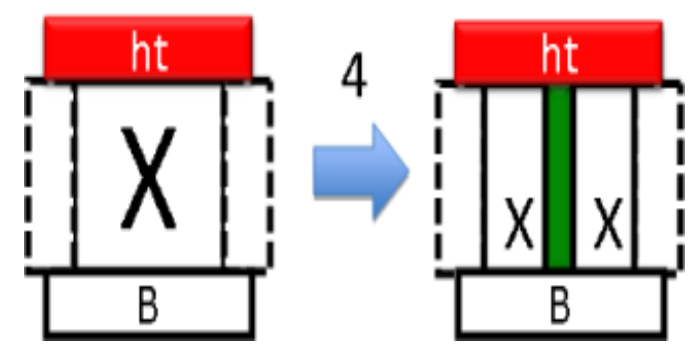
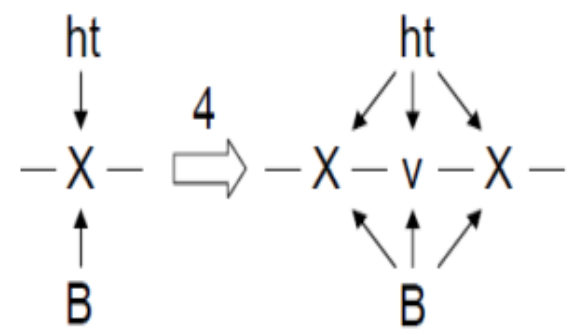


Production Rule 2

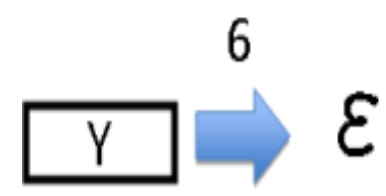
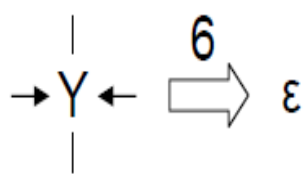


# Examples of Production Rules

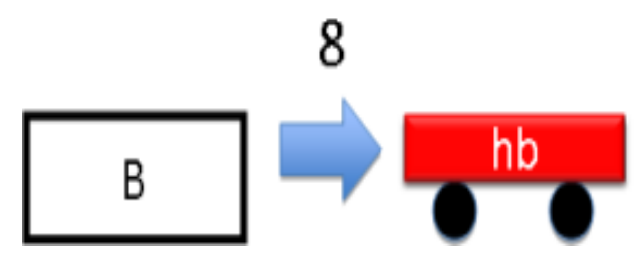
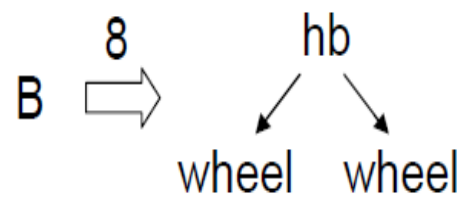
Production Rule 4



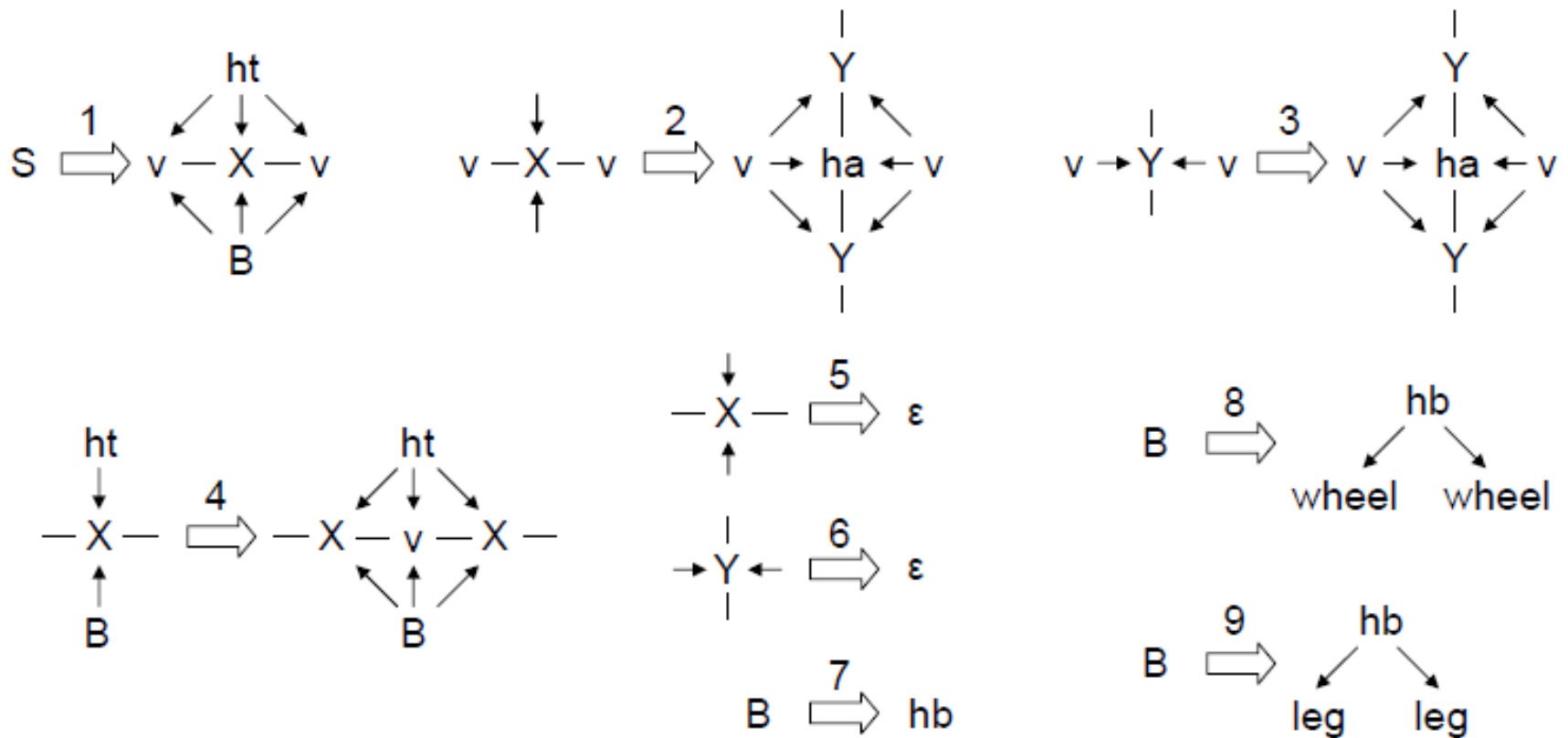
Production Rule 6



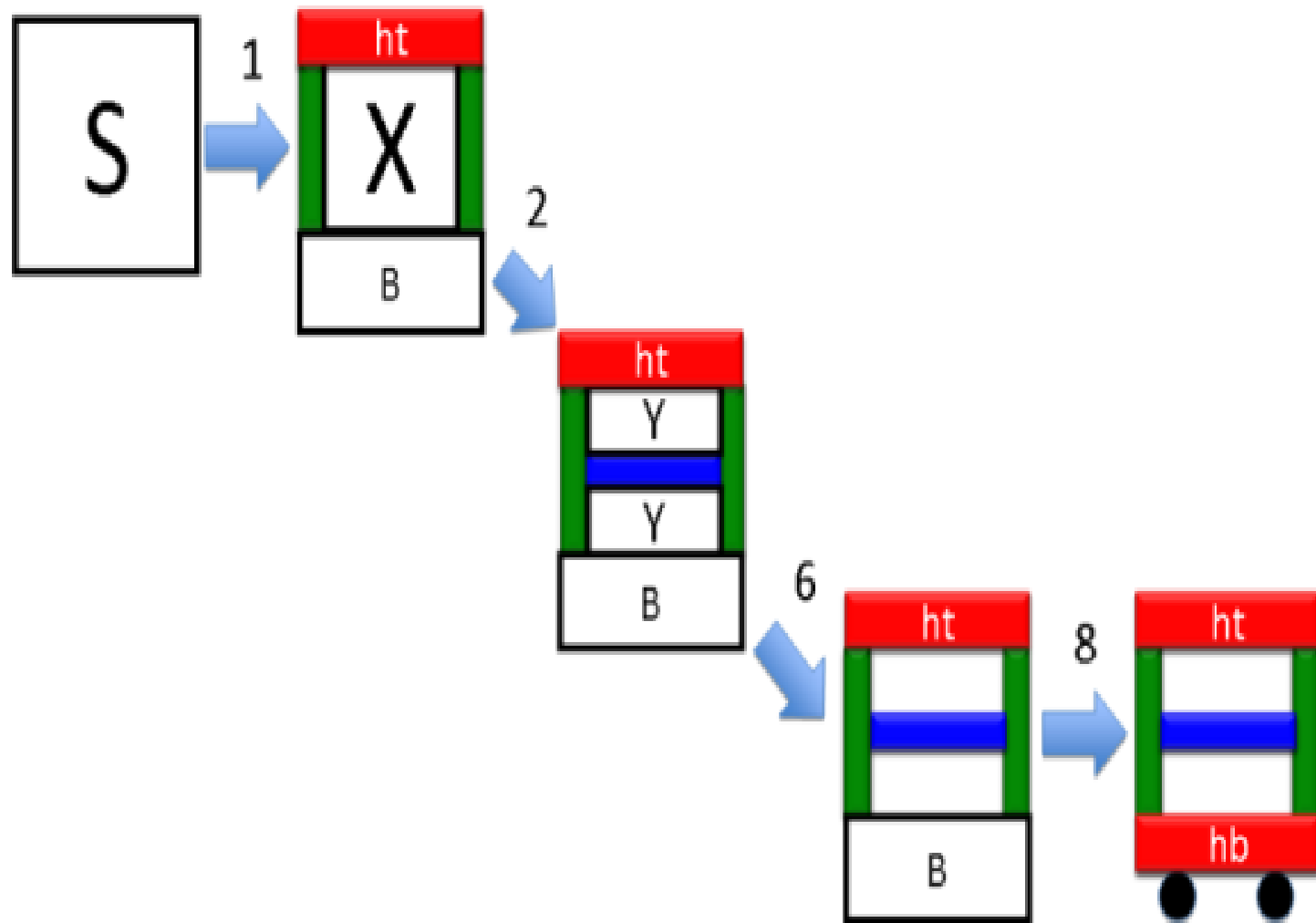
Production Rule 8



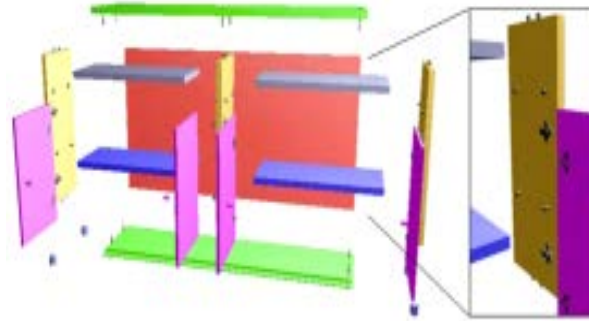
# All Production Rules



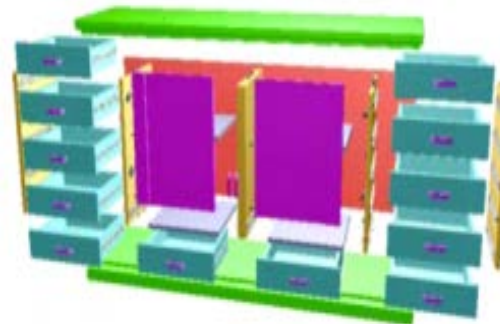
# Sequence of Production Rules



# Inverse Procedural Modelling



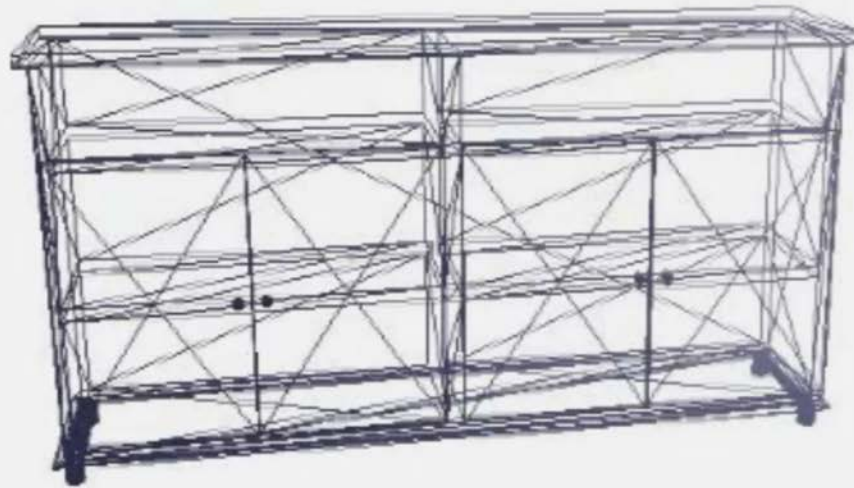
Input:  
3D  
model



Output:  
Fabricatable  
Parts and  
Connectors



# Results: IKEA ALVE Cabinet

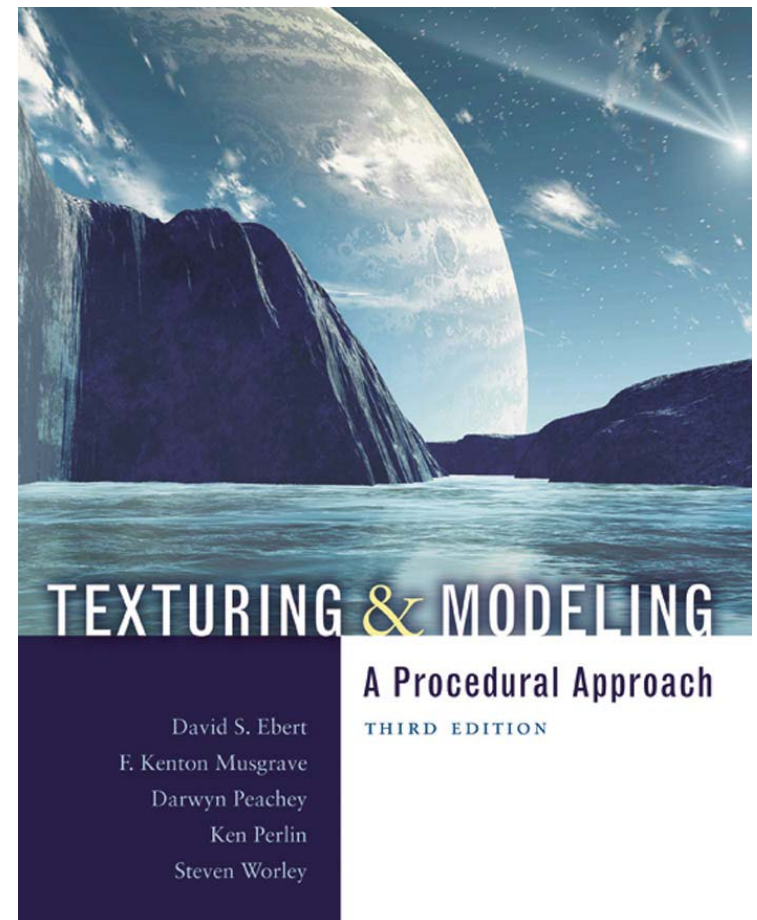


**Input: 3D model (Google Warehouse)**  
**IKEA ALVE cabinet**



# Further Reading in Procedural Techniques

- Texturing and Modeling - A Procedural Approach



# That's All For Today

- Readings:
  - The Algorithmic Beauty of Plants (Chapter 1)
    - *Chapter 1: Graphical modeling using L-systems*
    - <http://algorithmicbotany.org/papers/abop/abop-ch1.pdf>
  - *Procedural Modeling of Buildings / Müller et al, Siggraph 2006*
  - *Converting 3D Furniture Models to Fabricable Parts and Connectors, Lau et al., Siggraph 2011*