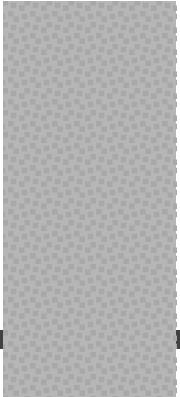


# Kolmogorov complexity of 2D sequences

Bruno Durand

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Fondamentale de Marseille



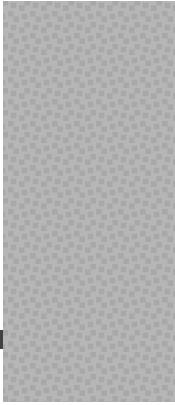
# Kolmogorov complexity

---

- # Goal: to measure the complexity of an individual object
- # (Shannon) theory of information: measures the complexity of a random variable
- # A theory of optimal compression

“the size of the smallest program that generates the object”

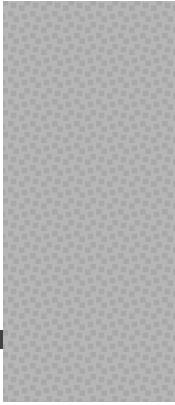
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# Examples

---

- #  $K(n) < \log(n) + c$
  - #  $K(2^n+17) < \log(n) + c$
  - #  $K(x^y) < \log(x) + \log(y) + c$
  - #  $K(x^y|y) < \log(x) + c$
  - # Strings with low complexity are rare
-



# Two theorems

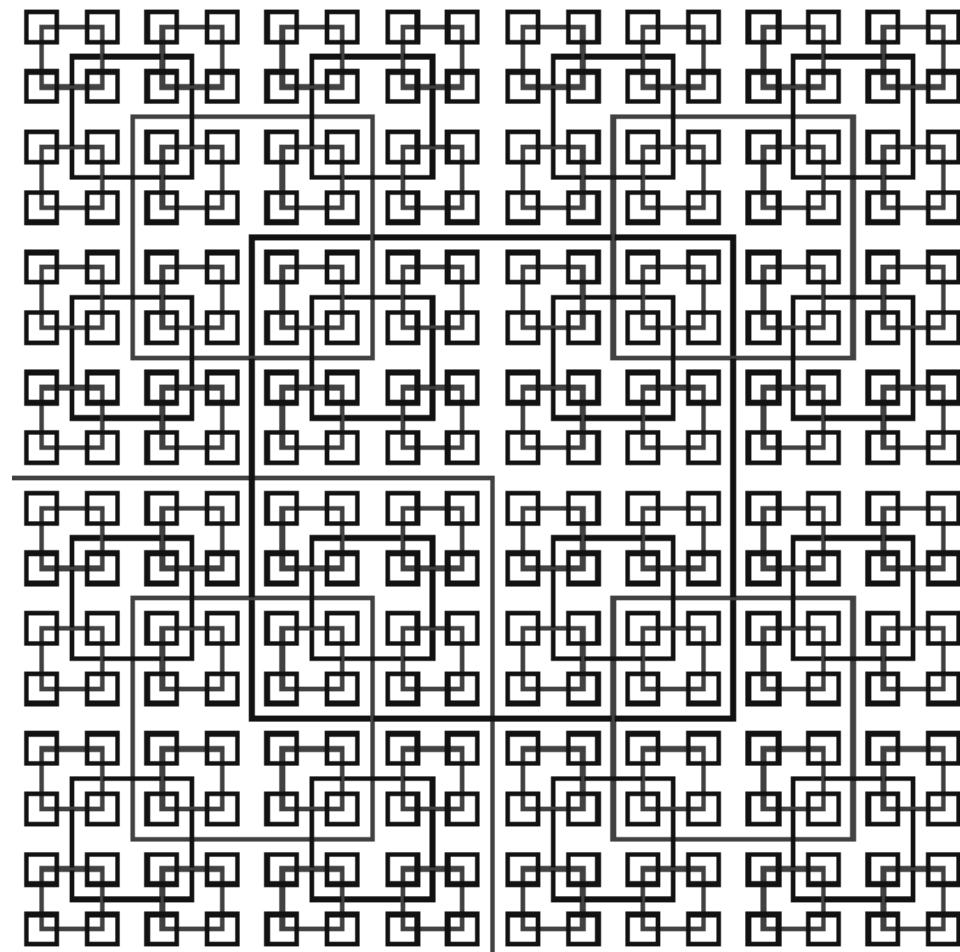
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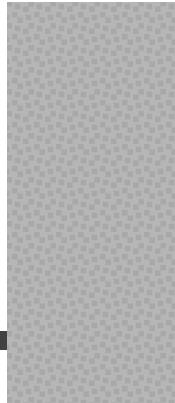
- The set of prime numbers is infinite
  - If  $K(x_0, x_1, \dots, x_n | n) < c$ , then  $x_i$  is computable
-

# Exemple of 2D infinite objects

---

A finitary drawing

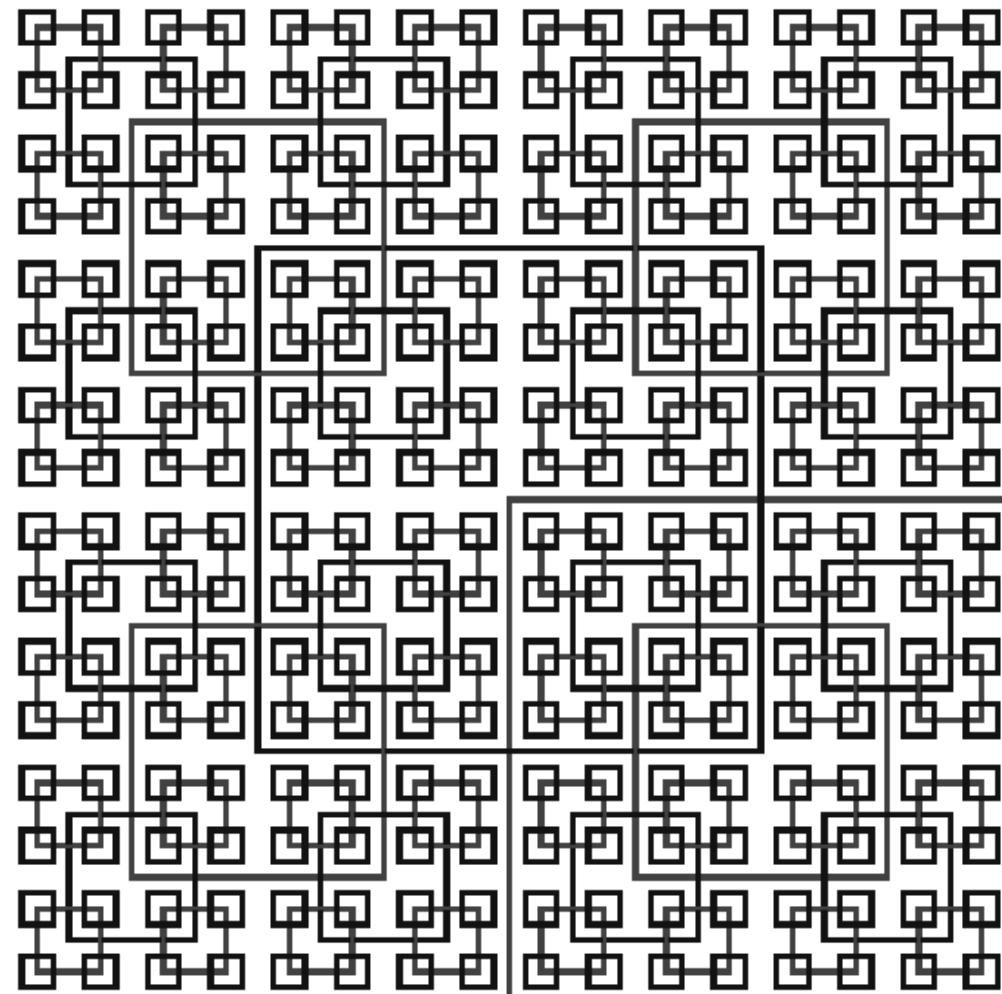
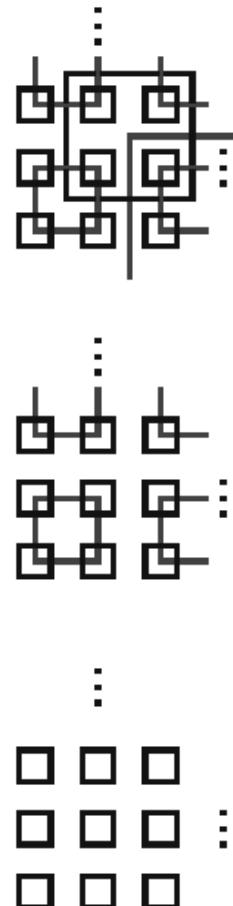


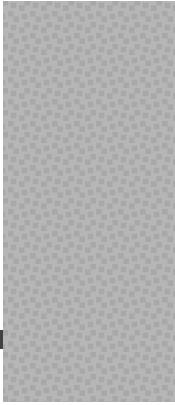


# This infinite object is “simple”

---

$n \times n$  squares  
have  $\log(n)$   
complexity

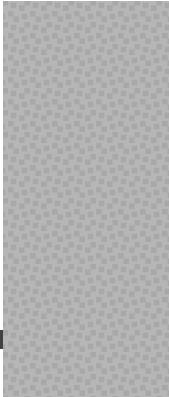




# Complex infinite objects

---

- # Flip a coin for each cell
  - # No structure
  - # Theorem (Levin Schnorr 1971):  
random configurations have maximal complexity. The complexity of all their  $nxn$ -squares centered in  $(0,0)$  is  $n^2$ .
-



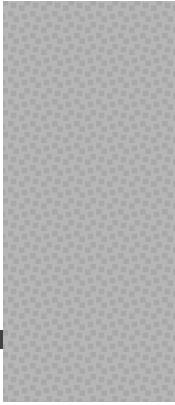
# Question of the day

---

What is the complexity induced by a finite set of local constraints?

Motivations: molecule arrangements, etc.

- Hilbert's 18th problem
  - Hilbert *das Entscheidungsproblem*
-



# Tile sets

---

- Wang tiles

- Squares with colored borders

- Tiles with arrows

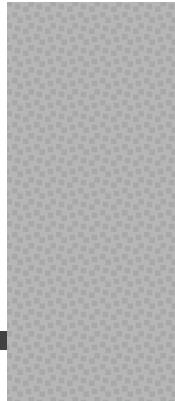
- Arrows and colors

- Polygons -- rational coordinates

- Correct arrangement

- ✓ No irrational coordinates (Penrose)

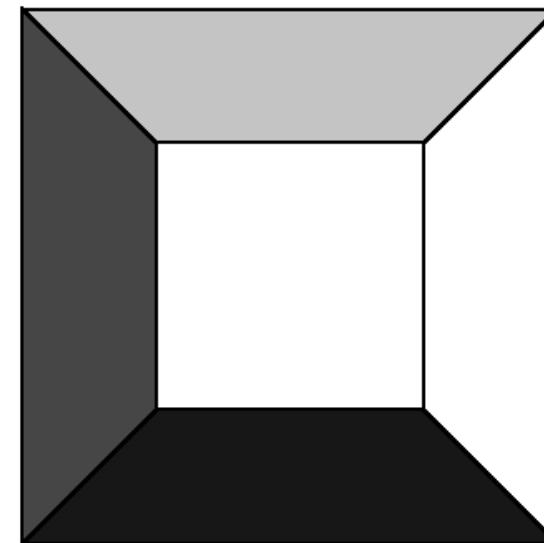
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# Wang tiles

---

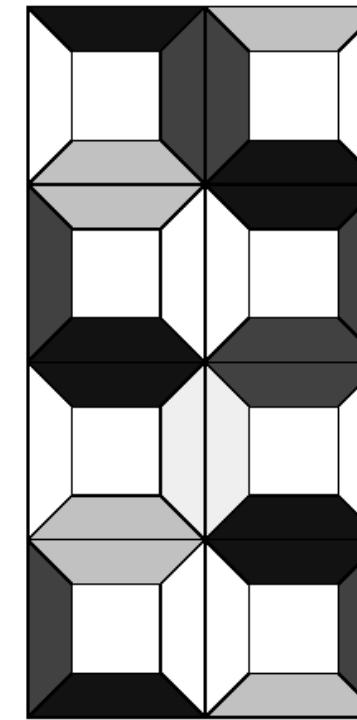
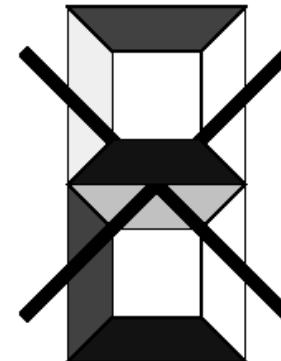
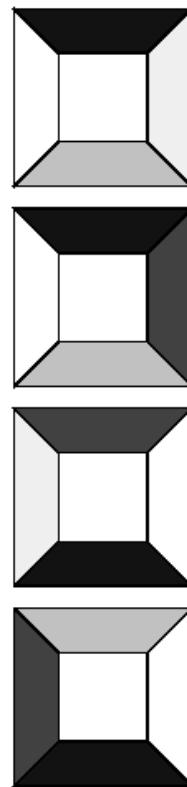
- Squares of unit size
- Colored borders
- No rotations
- Finite number
- Matching colors





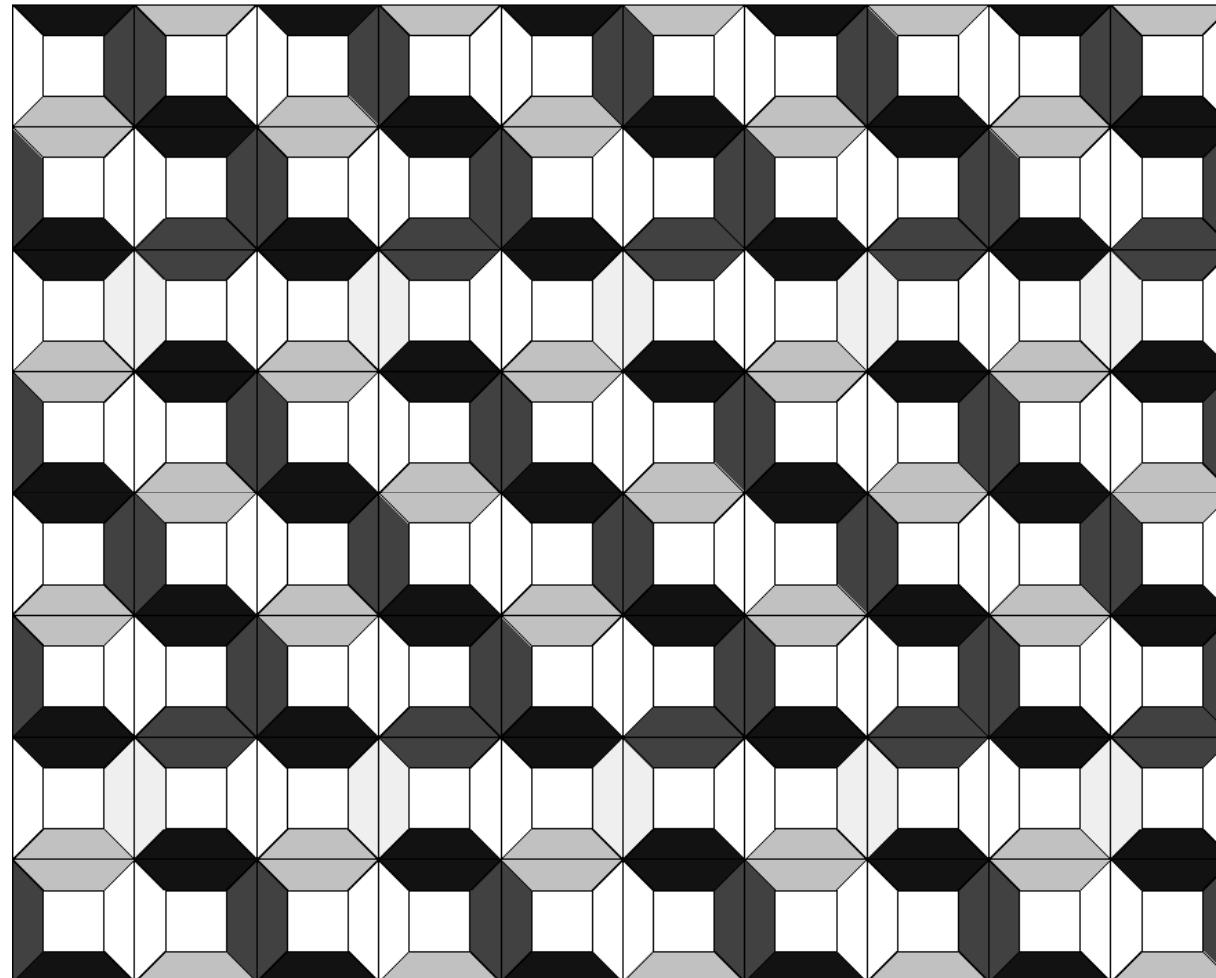
# Example - Wang tiles

---



# Periodic tiling obtained

---

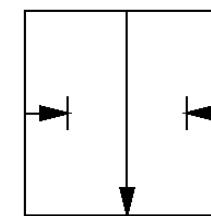
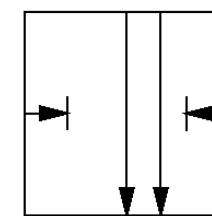
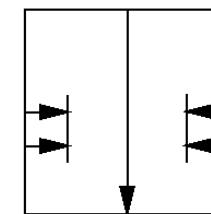
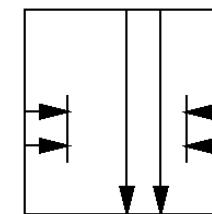
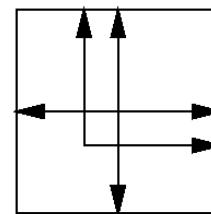


2x4

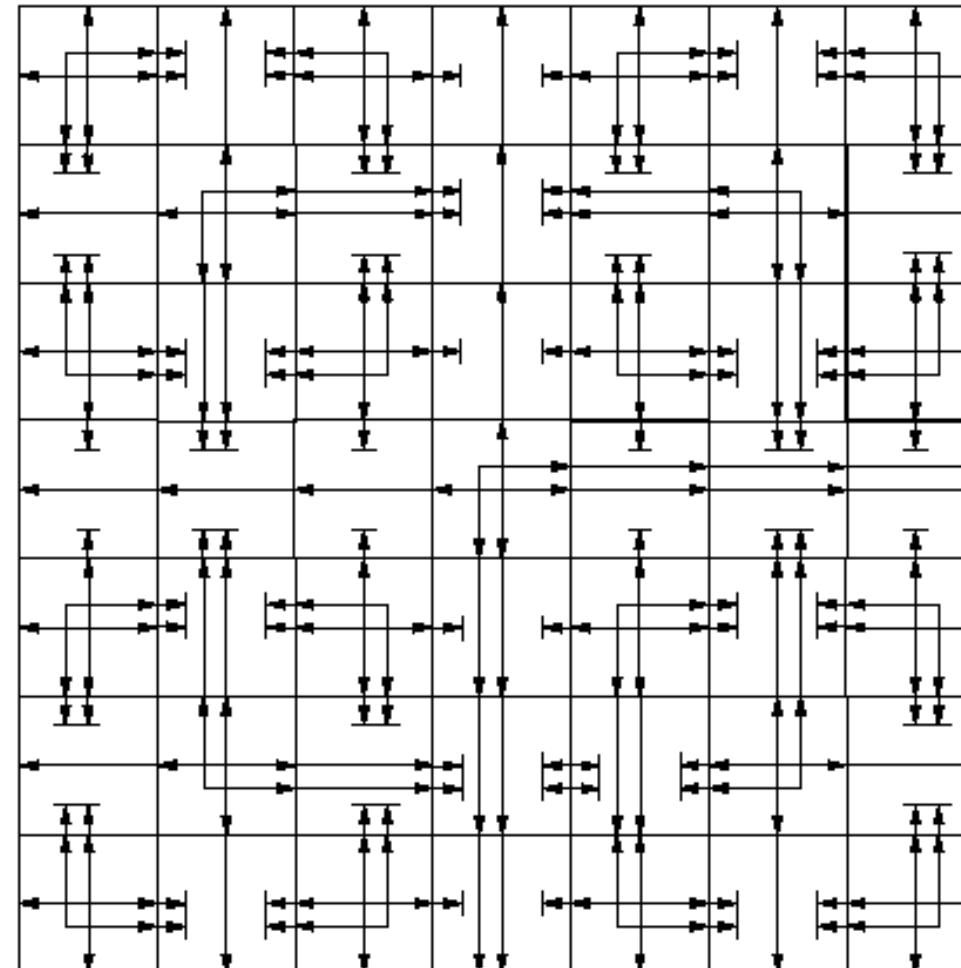
---

# Tiles with arrows

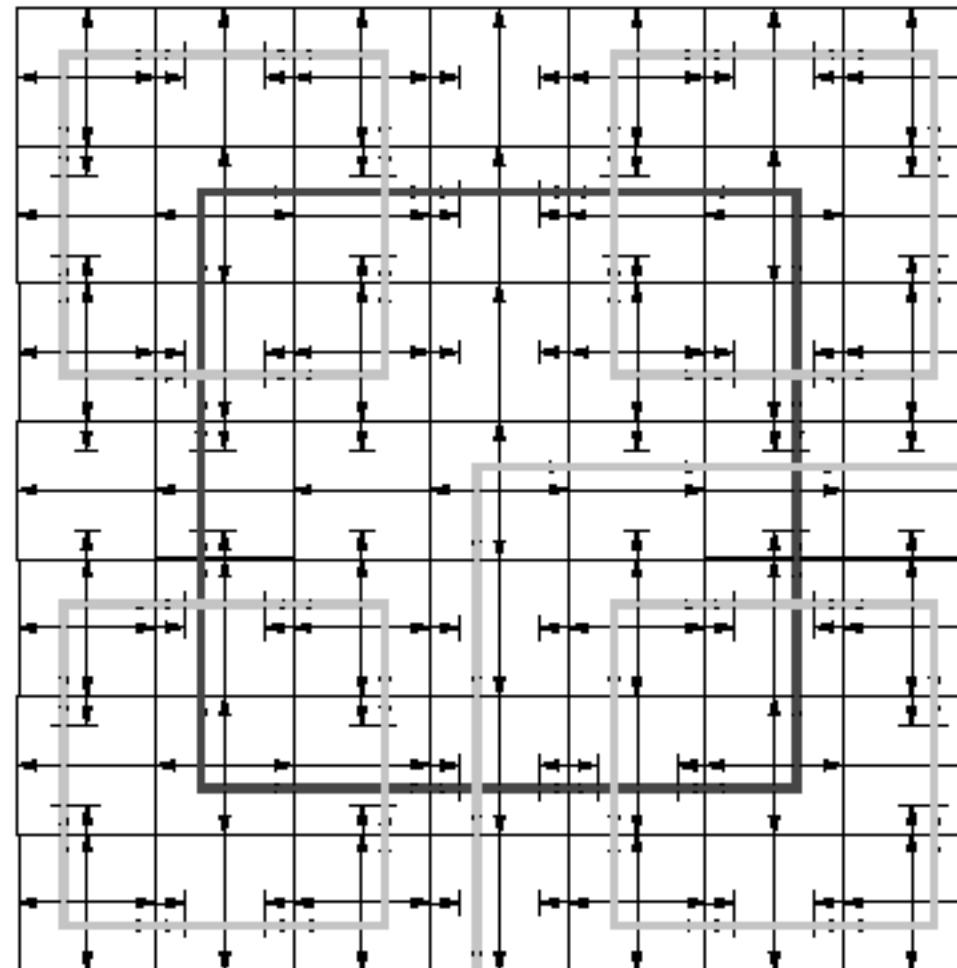
- # Squares of unit size
- # Arrows on borders
- # Rotations allowed
- # Finite number
- # Arrows must match



# Example - tiles with arrows

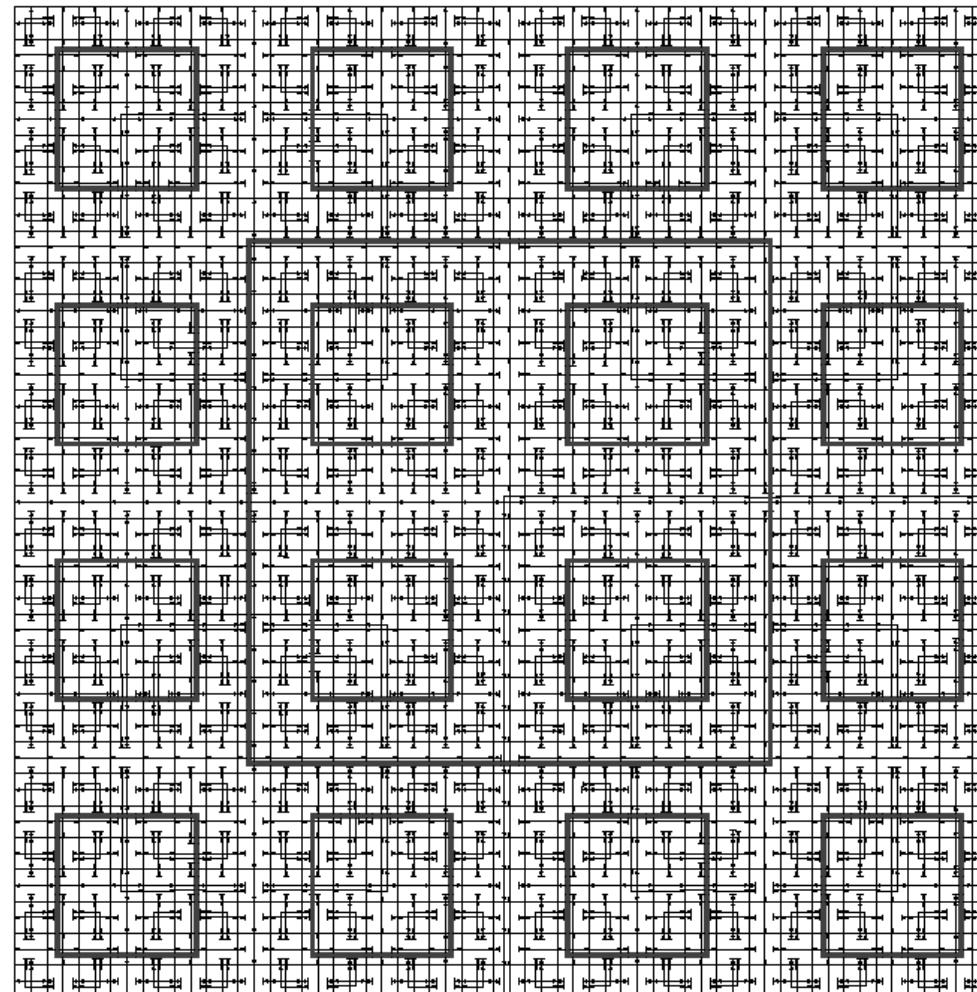


See something and...



...imagine more

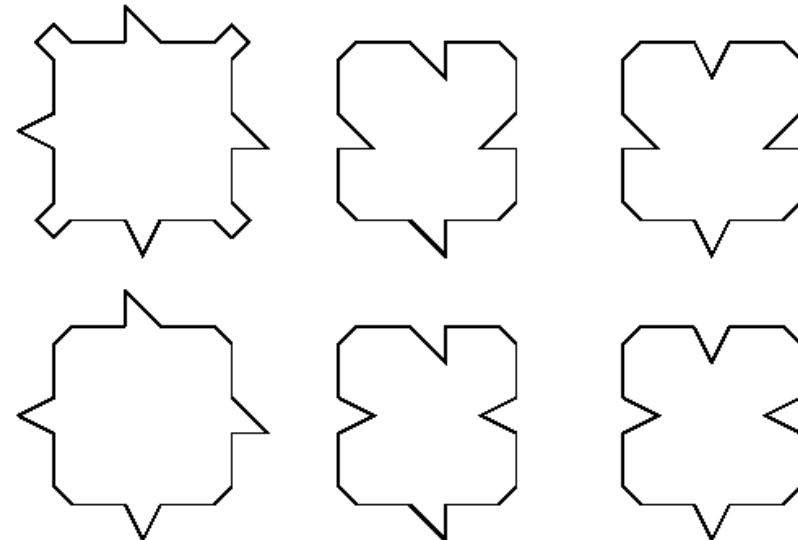
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# Polygons -- rational coordinates

---

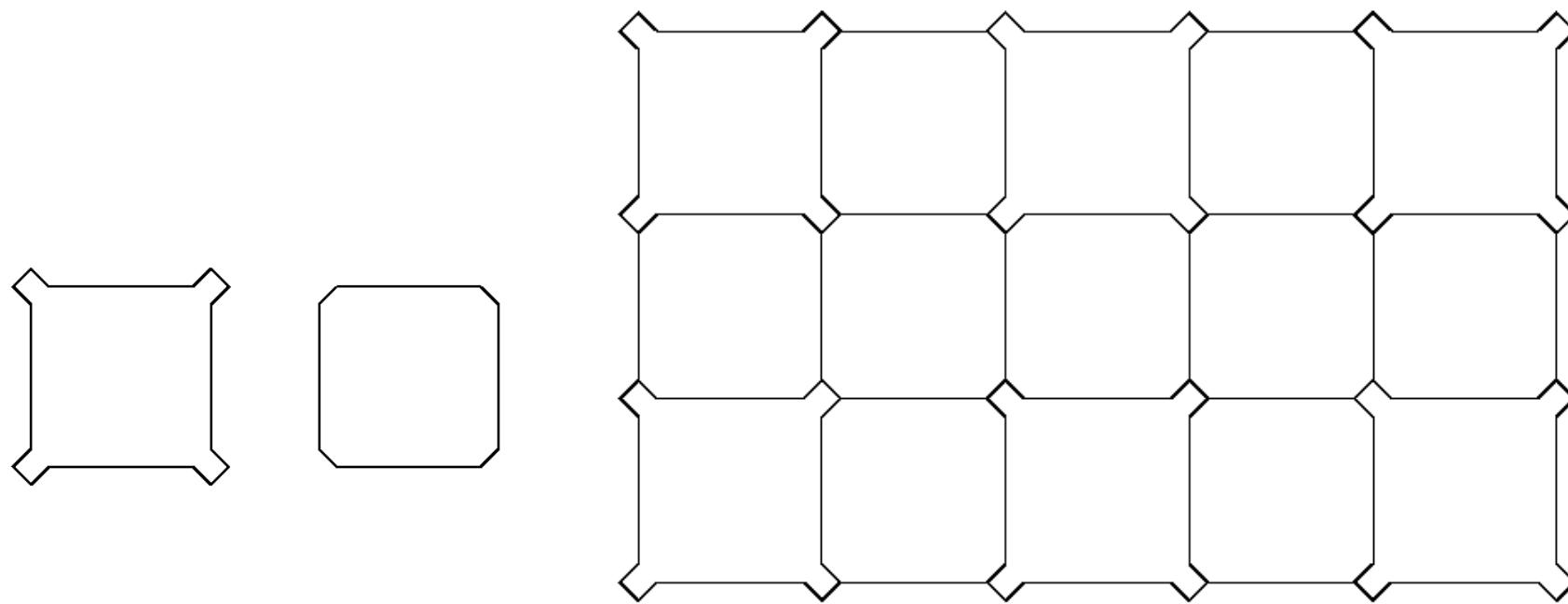
- # Polygon on a grid
- # Polygon simple
- # No rotations
- # Finite number
- # Correct arrangement



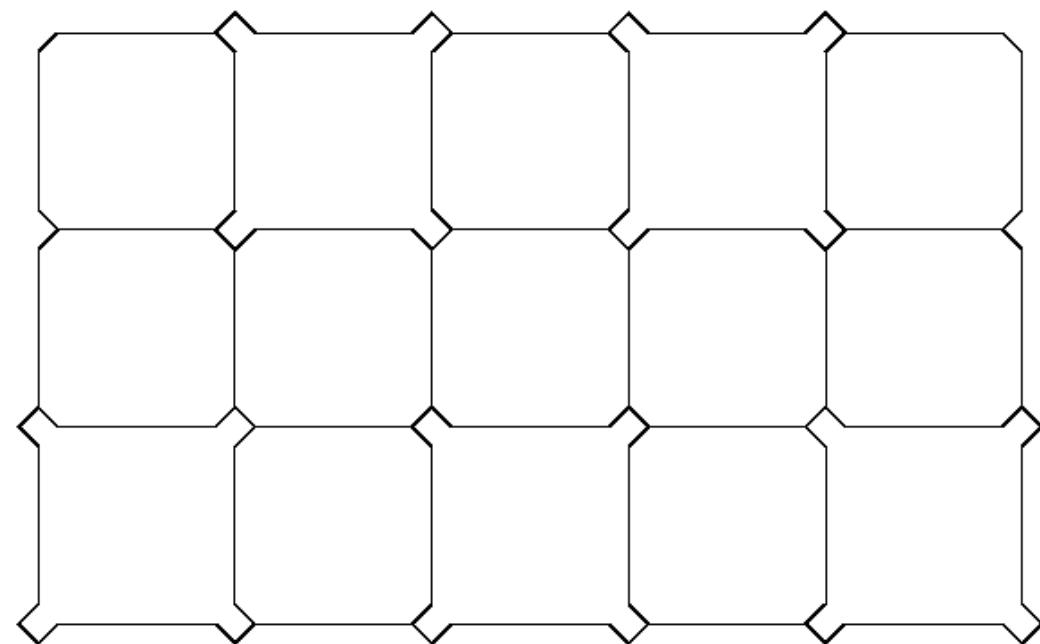
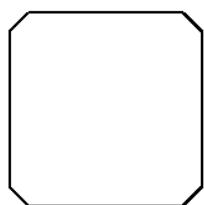
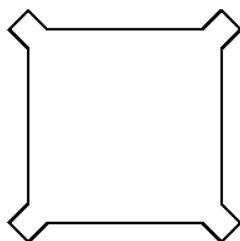


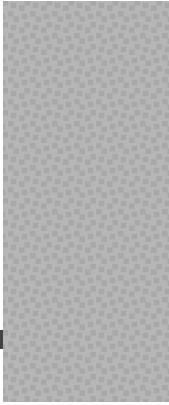
# Elementary example

---



And also...





# Tiling of a region

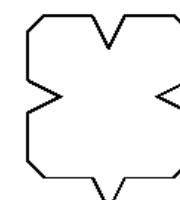
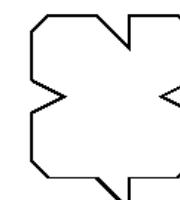
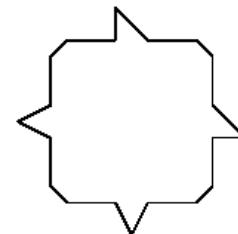
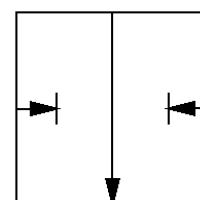
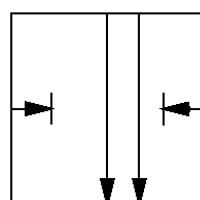
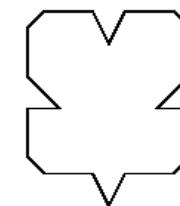
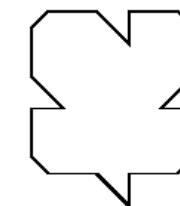
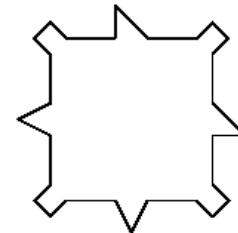
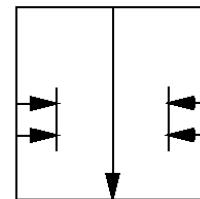
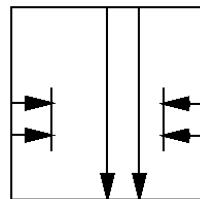
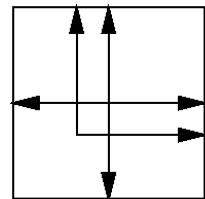
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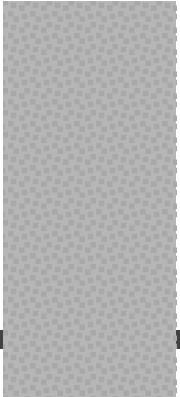
- The matching constraint must be ok inside the region
  - No constraint on the border
  - Examples:
    - Tiling of a rectangle
    - Tiling of a half-plane
    - Tiling of the plane
-

# Simulations

---

- # These models are equivalent for tilability of a region.
- # Some theory is needed here (skipped)



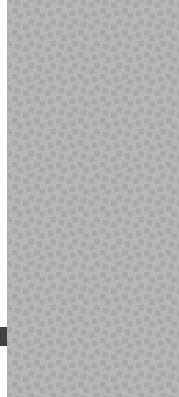


# A more general model: Local constraints

---

- # Planar configurations of 0's and 1's
- # A configuration is a tiling
  - if and only if
    - a local and uniform constraint is verified
      - Local : neighborhood
      - Uniform : same rule in each cell

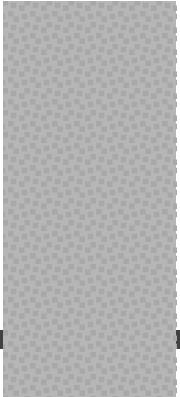




# Palettes

---

- A local constraint is a palette if and only if it can tile the plane (L. Levin)
    - Idem : Wang tiles
    - Idem : tiles with arrows
    - Idem : polygons
-



# « computation - geometry »

---

■ Decision problem : « domino problem »

- Input : a local constraint  $T$
- Question : is  $T$  a palette ?

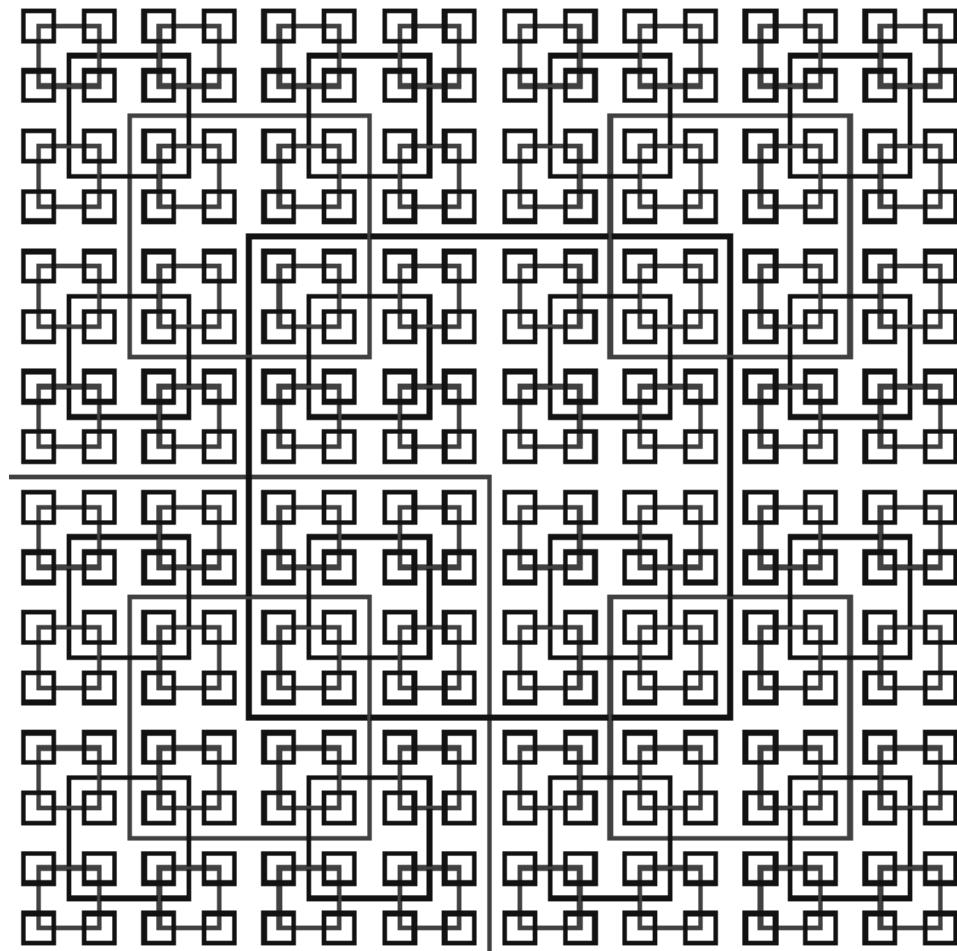
■ This problem is undecidable (Berger 1966)

---

# Break translational symmetry

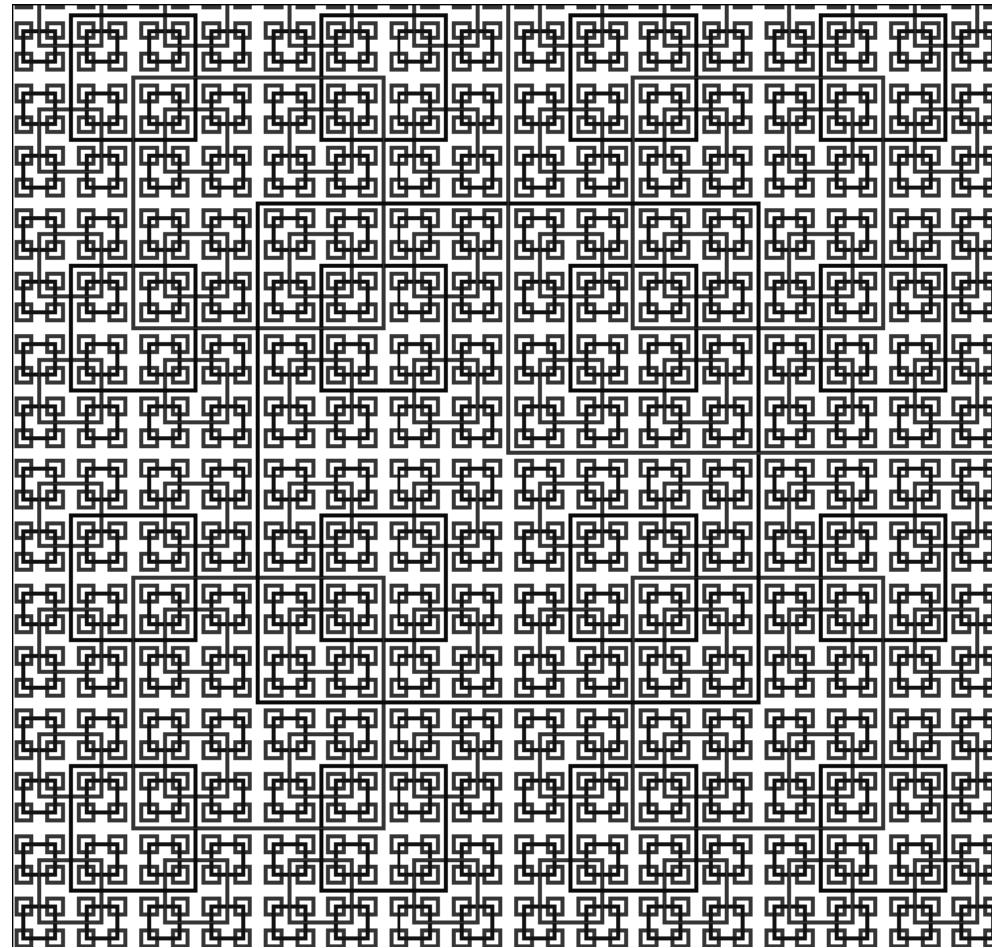
---

Nice configuration  
(little cheating...)

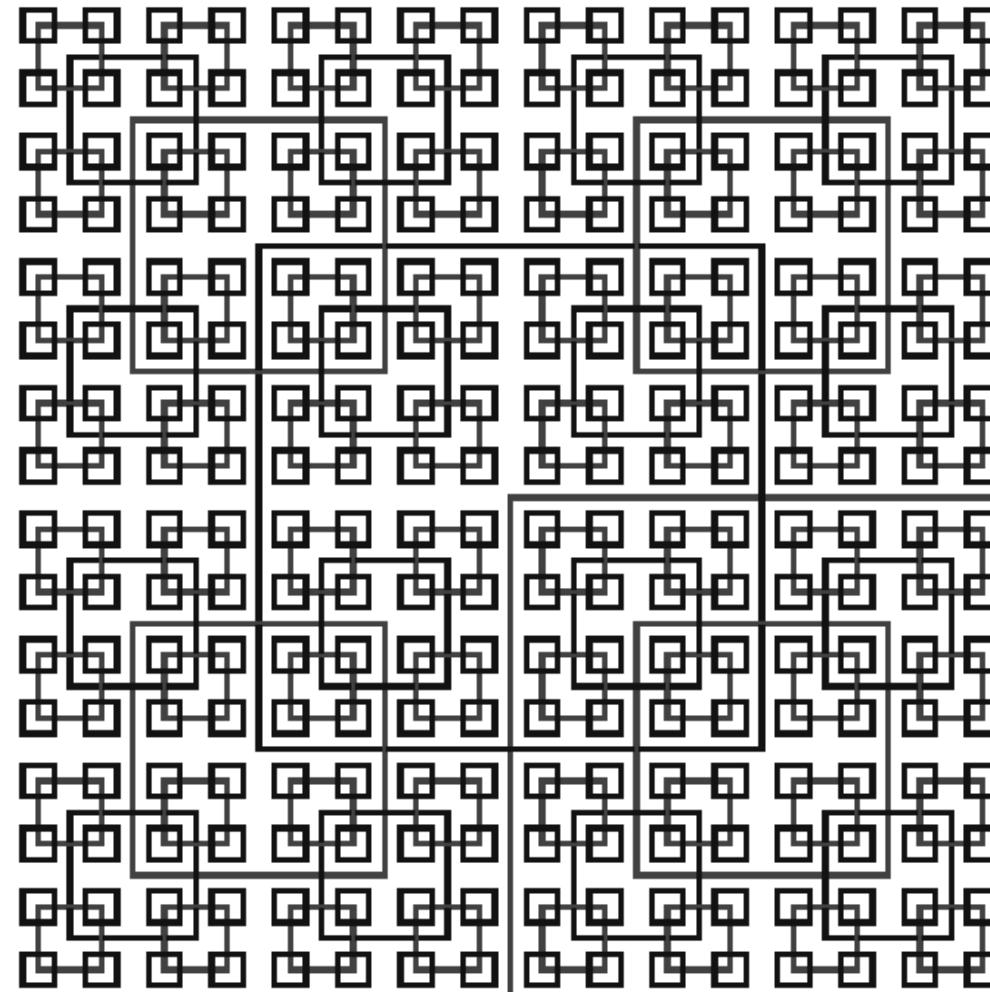
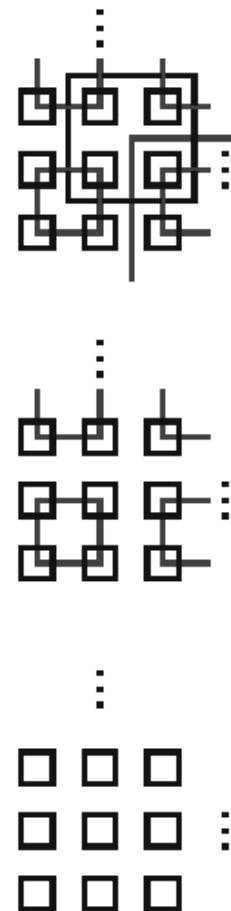


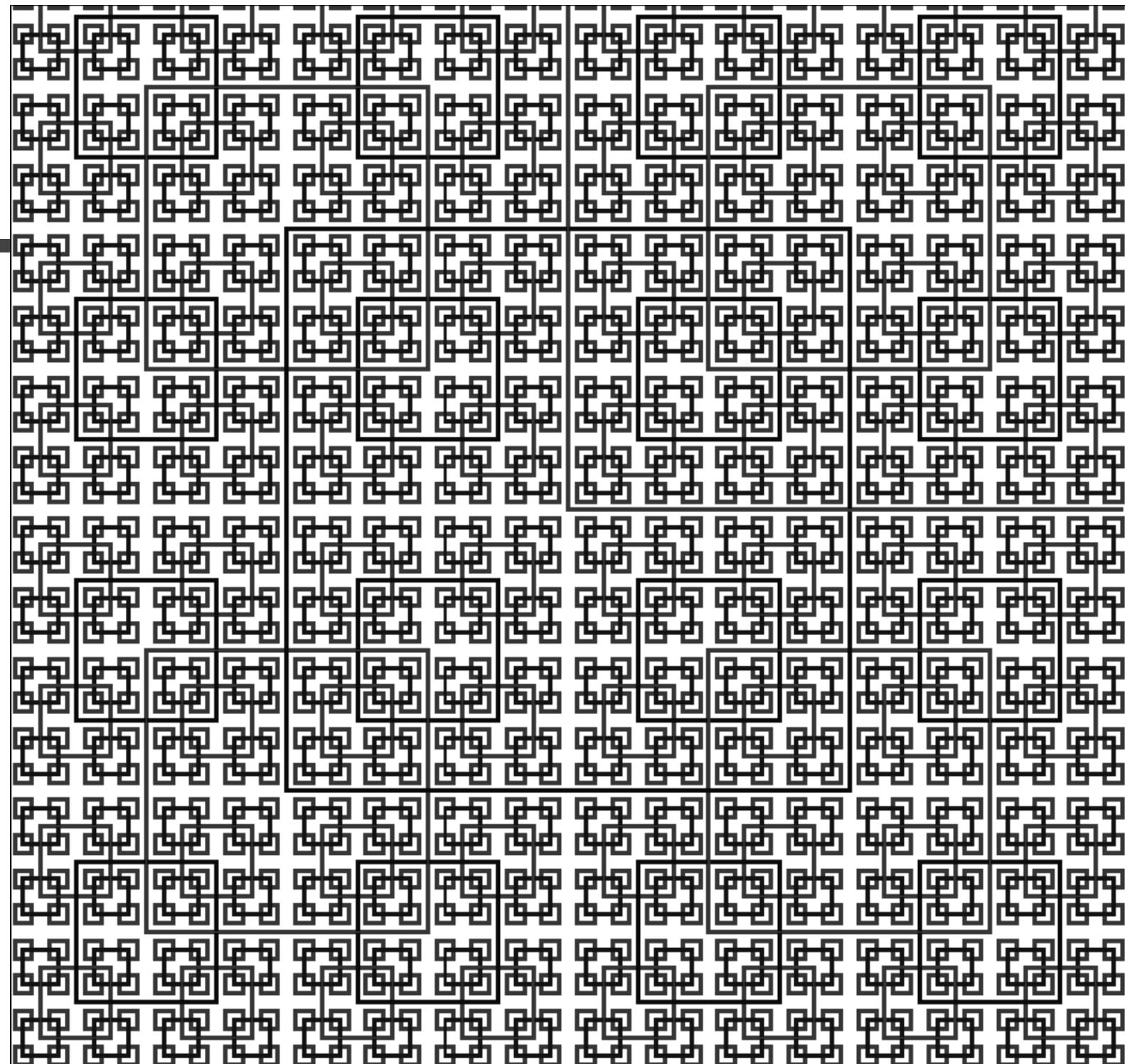
Still nicer : a carpet !

---

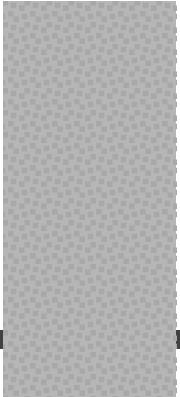


# How to build such carpets...





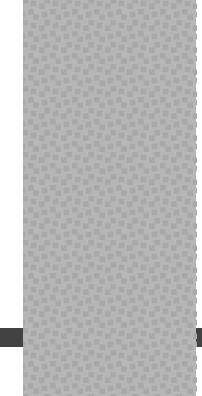
—



# How to express that

---

- # Carpets can be produced by tilings
    - or
  - # There exists a palette that produces carpets
    - or
  - # In all tilings by a palette, carpets appear
-

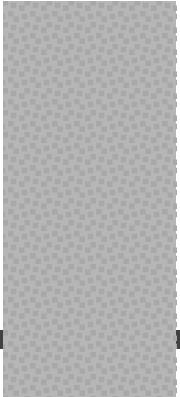


# Tilings enforced by a palette

---

A set of configurations that is

- # Shift invariant
  - # Compact
- 



# What we hope to enforce

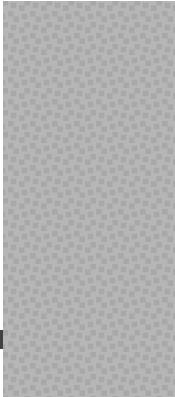
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Let  $c$  be a configuration

- The set of configurations that contain the same finite patterns than  $c$
- Id est :

$$\Gamma(c) = \overline{\bigcup_{i,j \in \mathbb{Z}} \{\sigma_h^i \circ \sigma_v^j(c)\}}.$$

---

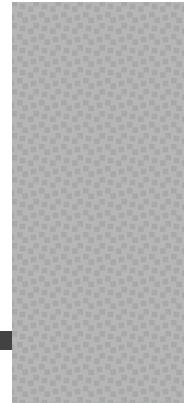


# The carpet is enforceable

---

Possible proofs:

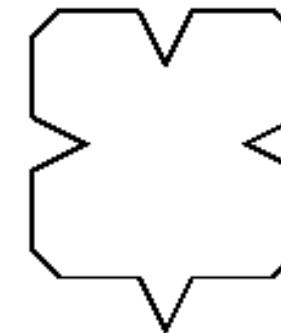
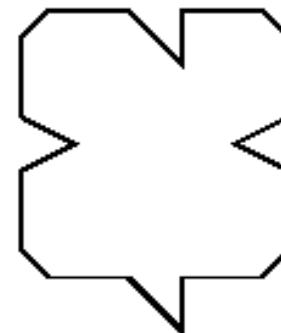
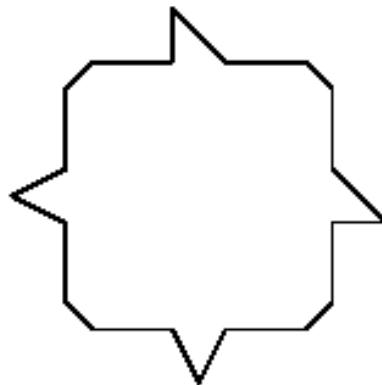
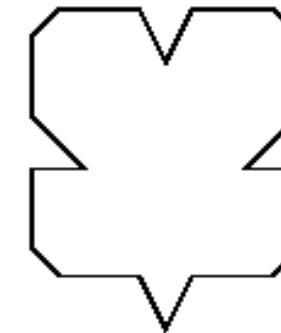
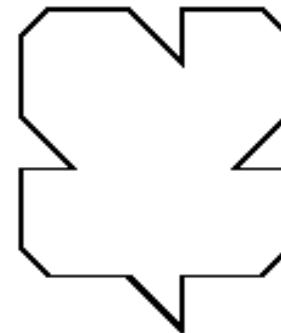
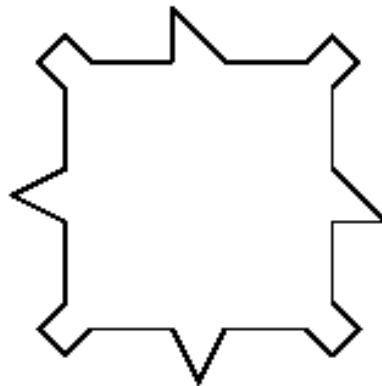
1. Give explicitly a palette that enforces it
  2. Give a construction method for such a palette
  3. Prove that such a palette exists
-

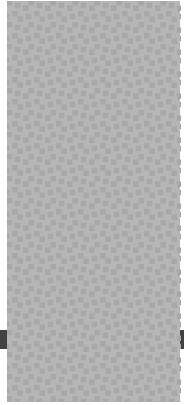


# 1. A palette that enforces carpets

---

More or less...





## 2. Construction method: self-similarity of carpets

---

- # Smallest squares are red and form a 2 steps grid
  - # Squares of same size are vertically and horizontally aligned
  - # In the center of a red square (resp. blue) lays a corner of a blue one (resp. red)
  - # Squares of same color are disjoined
- 



## 3. Existence proof

---

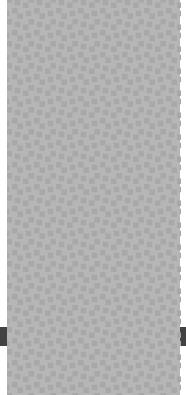
A configuration  $c$  is :

■ of finite type if and only if there exists  $n$  such that

$$\Gamma_n(c) = \Gamma(c)$$

■ of potentially finite type if and only if it can be « enriched » into a configuration of finite type.

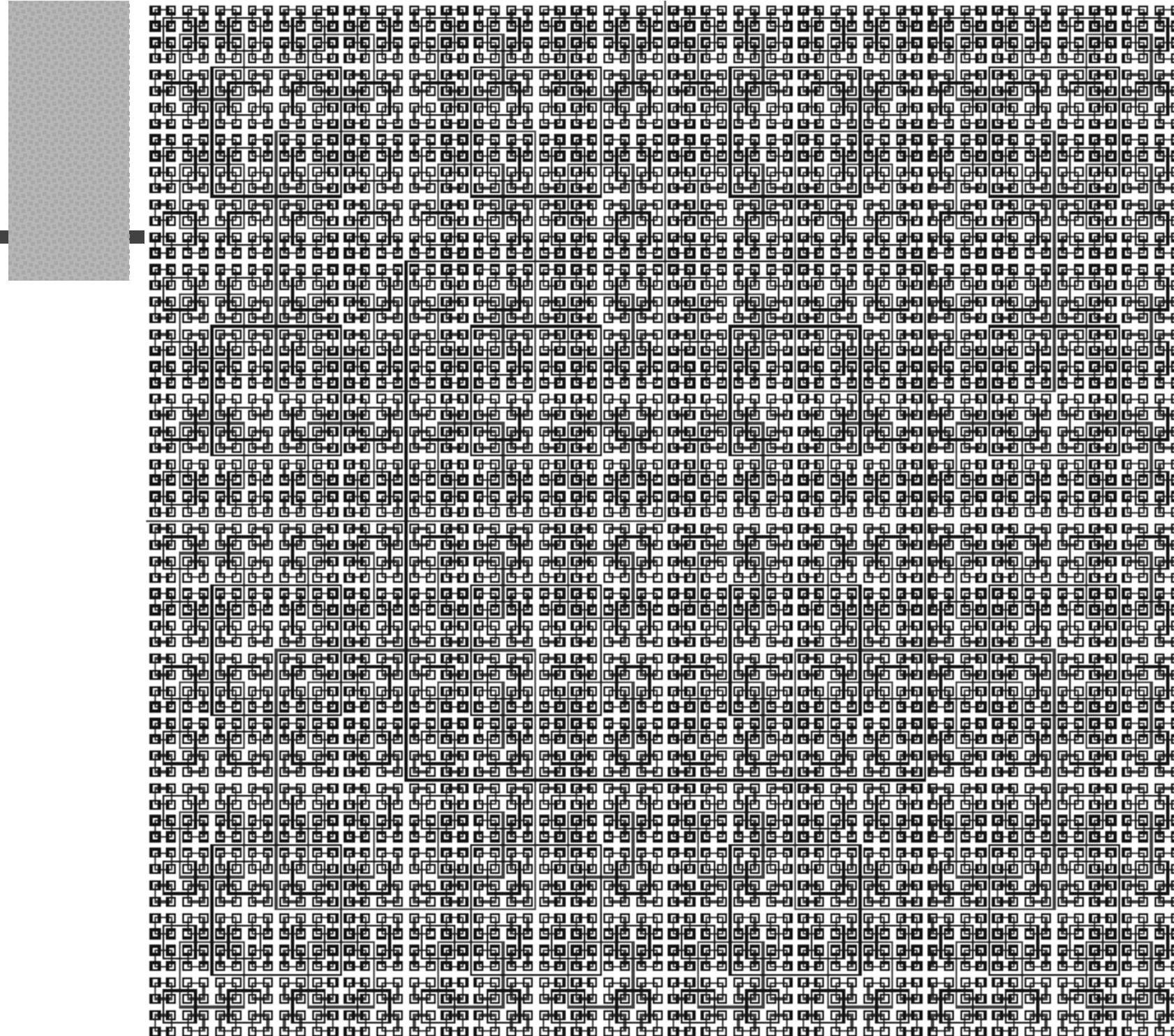
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# Finite types and tilability

---

- # A configuration is of potentially finite type if and only if it is enforced by a tiling.
  - # Theorem: the carpet is of potentially finite type.  
Constructive proof ( $n=2$ )
- 



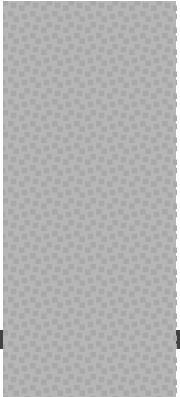


# Question of the day (bis)

---

Consider all tilings obtained with a considered palette.  
How complex is the simplest one?





# Theorems

---

- Undecidability of the « domino problem »... Applications in logics.  
(Berger 1966, Robinson 1971, Gurevich and Koriakov 1972)
  - There exists a palette that produces only non-recursive tilings (Hanf and Myers 1974) Cannot be improved (Albert Muchnik)
  - Complexity bound: Any palette can form at least a tiling in which squares of size  $n$  contain at most  $O(n)$  bits of information. (BD, Leonid Levin and Alexander Shen 2001)
  - There exists a palette s.t. for all tiling, any square of size  $n$  contains about  $n$  bits of information. (same paper - long version in preparation - ready November 2067) Checks that the infinite sequence is complex
  - Extensions to configurations that tolerate tiling errors?
-

# Complex tilings constructed

---

- # Aperiodic tile sets
- # Arecurcive tile sets  $(x,y) \sqsubset T(x,y)$
- # Complex tilings:
  - in all  $nxn$ -squares there are  $n$  bits of a random sequence  
(optimal)



# Complexity lemma

---

- An infinite sequence  $x$  is uniformly  $c$ -random if and only if there exists  $N$  such that for all  $k > N$  for all  $i$   $K(x_i \dots x_{i+k}) > ck$
- Lemma: For all  $c < 1$  there exists a uniformly  $c$ -random sequence
- works for bi-infinite sequences - no arbitrary large subsequences of 0's

The true end

---