# Acquiring Periodic Tilings of Regular Polygons from Images 

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Visgraf vision and
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Motivation: tile the plane with regular polygons



Rigidity: only 15 vertex neighborhoods


Rigidity: only 11 tilings are 1-uniform


$\left(4^{4}\right)$

$\left(6^{3}\right)$


( $3^{3} \cdot 4^{2}$ )

(3 ${ }^{2}$.4.3.4)

(3.4.6.4)


$\left(3.12^{2}\right)$

(4.6.12)

Goal: represent, synthesize, and analyze complex $k$-uniform tilings


## Outline

image


## Outline

image


## Outline



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- Tile arbitrarily large areas


## Outline



- Tile arbitrarily large areas
- Establish properties of the symbol


## Outline



- Tile arbitrarily large areas
- Establish properties of the symbol
- Allow further analysis of the tilings



## Understanding tilings: many symmetries



Understanding tilings: translation symmetries


## Understanding tilings: fundamental domain



Regular systems of points
Hilbert \& Cohn-Vossen (1952)


Regular systems of points

$$
\left.\begin{array}{lll}
\bullet & \bullet
\end{array}\right)
$$

## Reconstruct tiling from vertices

$$
\begin{aligned}
& \text { - } \\
& \text { er }
\end{aligned}
$$

Reconstruct tiling from vertices: edges


Reconstruct tiling from vertices: translation grid


Reconstruct tiling from vertices: fundamental domain


Reconstruct tiling from vertices: patch


Reconstruct tiling from vertices: full tiling


Edges aligned to a few basic directions

roots of unity

$$
\omega^{12}=1, \quad \omega=e^{\frac{2 \pi i}{12}}
$$

$$
\omega^{n}=e^{\frac{2 \pi i}{12} n}, \quad n \in\{0,1, \ldots, 11\}
$$



Edges aligned to a few basic directions


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$\omega^{0}$
$\omega^{2}$
$\omega^{5}$

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$\omega^{2}$
-
$\omega^{5}$
$\omega^{7}$

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- 

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-
$\omega^{11}$

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- $\begin{aligned} & \omega^{11} \\ & \\ & \omega^{2} \\ & \\ & \omega^{4}\end{aligned}$

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$\omega^{2}$


Vertices as integer linear combinations of basic directions


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Vertices as integer linear combinations of basic directions

$\omega+\omega^{10}$

Vertices as integer linear combinations of basic directions

$\omega+\omega^{10}+\omega^{11}$

Vertices as integer linear combinations of basic directions


$$
\omega+\omega^{10}+\omega^{11}+\omega^{0}
$$

Vertices as integer linear combinations of basic directions


$$
\omega+\omega^{10}+\omega^{11}+\omega^{0}+\omega
$$

Vertices as integer linear combinations of basic directions

$\omega+\omega^{10}+\omega^{11}+\omega^{0}+\omega+\omega^{2}$

Vertices as integer linear combinations of basic directions

$\omega+\omega^{10}+\omega^{11}+\omega^{0}+\omega+\omega^{2}+\omega^{3}$

Vertices as integer linear combinations of basic directions

$\omega+\omega^{10}+\omega^{11}+\omega^{0}+\omega+\omega^{2}+\omega^{3}=\omega^{11}+\omega^{10}+\omega^{3}+\omega^{2}+2 \omega+1$

Vertices as integer linear combinations of basic directions

$\omega+\omega^{10}+\omega^{11}+\omega^{0}+\omega+\omega^{2}+\omega^{3}=\omega^{11}+\omega^{10}+\omega^{3}+\omega^{2}+2 \omega+1=V-O$

Translations as integer linear combinations of basic directions


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Translations as integer linear combinations of basic directions


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Translations as integer linear combinations of basic directions

$\omega+\omega^{3}+\omega^{2}+\omega^{3}+\omega^{2}+\omega+\omega^{11}$

Translations as integer linear combinations of basic directions


$$
\omega+\omega^{3}+\omega^{2}+\omega^{3}+\omega^{2}+\omega+\omega^{11}=\omega^{11}+2 \omega^{3}+2 \omega^{2}+2 \omega
$$

Translations as integer linear combinations of basic directions

$\omega+\omega^{3}+\omega^{2}+\omega^{3}+\omega^{2}+\omega+\omega^{11}=\omega^{11}+2 \omega^{3}+2 \omega^{2}+2 \omega=T-O$

## Tiling symbols

Vertices and translation vectors are expressed in $\mathbb{Z}[\omega]=$ polynomials in $\omega$

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Polynomials in $\omega$ reduced $\bmod \omega^{4}-\omega^{2}+1$, the minimal polynomial of $\omega$ :

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$$
\begin{array}{rll}
\omega^{4} & =-1+\omega^{2} & =[-1,0,1,0] \\
\omega^{5} & =-\omega+\omega^{3} & =[0,-1,0,1] \\
\omega^{6} & =-1 & =[-1,0,0,0] \\
\omega^{7} & =-\omega & =[0,-1,0,0] \\
\omega^{8} & =-\omega^{2} & =[0,0,-1,0] \\
\omega^{9} & =-\omega^{3} & =[0,0,0,-1] \\
\omega^{10} & =1-\omega^{2} & =[1,0,-1,0] \\
\omega^{11} & =\omega-\omega^{3} & =[0,1,0,-1]
\end{array}
$$

## Tiling symbols

Each tiling is represented by:

- two translation vectors
define the fundamental region
- set of seeds
vertices inside fundamental region
- translation vectors and seeds expressed as integer linear combinations of basic directions


## Tiling symbols


translation
vectors

## seeds

$$
\begin{aligned}
S_{1} & =[0,0,0,0] \\
S_{2} & =[0,2,1,0] \\
S_{3} & =[0,3,1,0] \\
S_{4} & =[1,1,0,0] \\
& \vdots \\
S_{25} & =[2,1,1,3]
\end{aligned}
$$

Book \& catalogue: 200+ Arquimedean tilings

"Sobre malhas arquimedianas", Ricardo Sá e Asla Medeiros e Sá, 2017


$\Leftrightarrow \ggg \gg$




## \# $A_{\{H, L, M, N, Q, T, U\}}$


\#A\{H,L,M,N, Q,T,U\}

\#D $\{\mathrm{H}, \mathrm{L}, \mathrm{M}, \mathrm{N}, \mathrm{Q}, \mathrm{T}, \mathrm{U}\}$


## Web catalogue: 1248 tilings



SVG samples in Wikipedia for $n \leq 5$

Numbers of Tilings

|  |  | m-Archimedean |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 | > 14 | Total |
|  | 1 | 11 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 11 |
|  | 2 | 0 | 20 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 20 |
|  | 3 | 0 | 22 | 39 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 61 |
|  | 4 | 0 | 33 | 85 | 33 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 151 |
| $\square$ | 5 | 0 | 74 | 149 | 94 | 15 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 332 |
| - | 6 | 0 | 100 | 284 | 187 | 92 | 10 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 673 |
| U | 7 | 0 | ? | ? | ? | ? | ? | 7 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | ? |
| n | 8 | 0 | ? | ? | ? | ? | ? | 20 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | ? |
| $f$ | 9 | 0 | ? | ? | ? | ? | ? | ? | 8 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | ? |
| 0 | 10 | 0 | ? | ? | ? | ? | ? | ? | 27 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | ? |
| r | 11 | 0 | ? | ? | ? | ? | ? | ? | ? | 1 | 0 | 0 | 0 | 0 | 0 | 0 | ? |
| n | 12 | 0 | ? | ? | ? | ? | ? | ? | ? | ? | 0 | 0 | 0 | 0 | 0 | 0 | ? |
|  | 13 | 0 | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | 0 | 0 | 0 | ? |
|  | 14 | 0 | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | 0 | 0 | ? |
|  | >14 | 0 | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | 0 | ? |
|  | Total | 11 | $\infty$ | $\infty$ | $\infty$ | $\infty$ | $\infty$ | $\infty$ | $\infty$ | $\infty$ | $\infty$ | $\infty$ | $\infty$ | $\infty$ | $\infty$ | 0 | $\infty$ |

THE ON-LINE ENCYCLOPEDIA OF INTEGER SEQUENCES ${ }^{\text {® }}$
founded in 1964 by N. J. A. Sloane

1. Find approximate coordinates for the vertices

2. Correct the vertices: basic directions + unit length $\rightarrow \mathbb{Z}[\omega]$


3. Find the edges: stars

4. Find the translations: transitive equivalence + score

5. Find the seeds

6. Minimize translation vectors


Match equivalent tilings


## Equivalent representations

- many choices for translation vectors given a translation grid



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## Equivalent representations

Translation vectors can be written as $T=A W$ :

$$
\binom{t_{1}}{t_{2}}=\left(\begin{array}{llll}
a_{11} & a_{12} & a_{13} & a_{14} \\
a_{21} & a_{22} & a_{23} & a_{24}
\end{array}\right)\left(\begin{array}{c}
1 \\
\omega \\
\omega^{2} \\
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All rotations and origin choices are tested

## Web interface to catalogue



## Results and future work

- State-of-the-art collections of tilings acquired and represented (1300+ tilings)


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- State-of-the-art collections of tilings acquired and represented (1300+ tilings)
- Identified all coincidences between the collections (148)
- Analysis of the symbols: numerics and combinatorics
- Test of hypotheses and new methods
- Nice image synthesis applications


Web interface to catalogue

www.impa.br/~cheque/tiling/

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