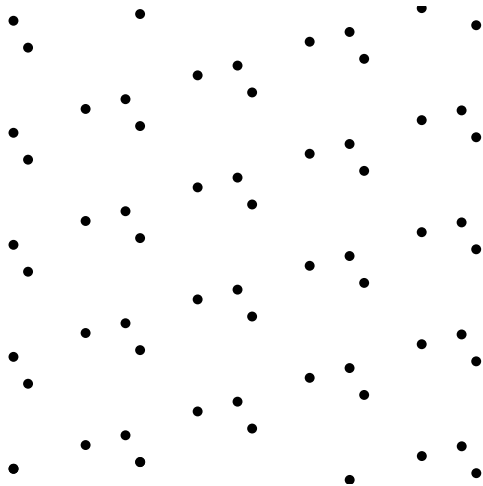


# Generalizing CGAL Periodic Delaunay Triangulations

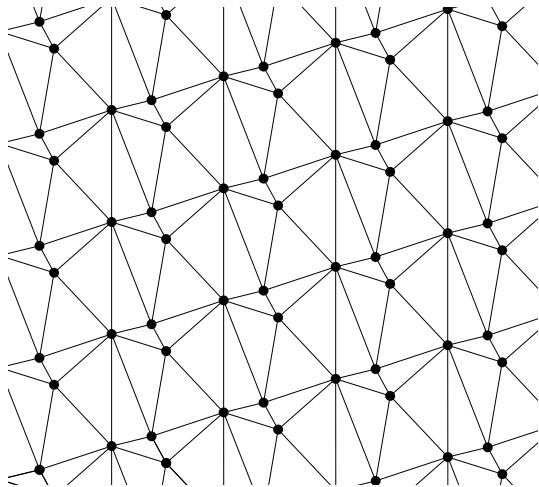
**Georg Osang**, Mael Rouxel-Labbé and Monique Teillaud

September 8th, 2020

# Periodic Delaunay triangulations



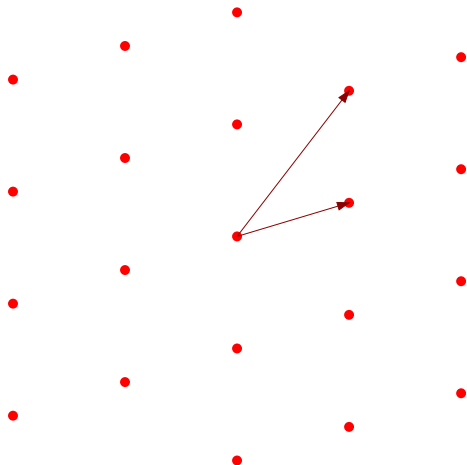
# Periodic Delaunay triangulations



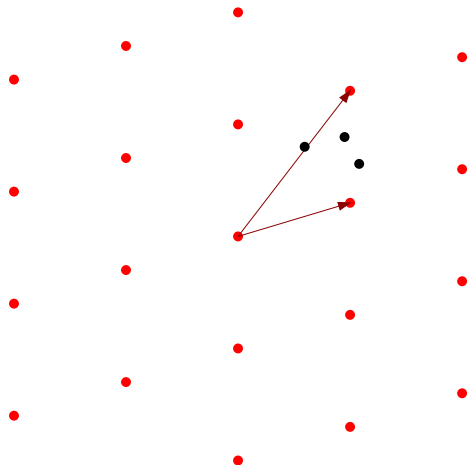
# Periodic Delaunay triangulations

Input:

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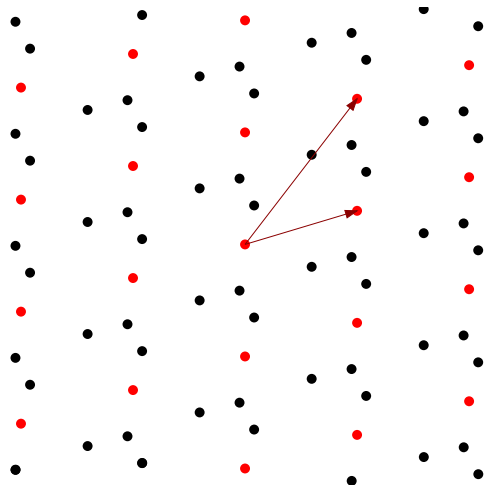
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Input:

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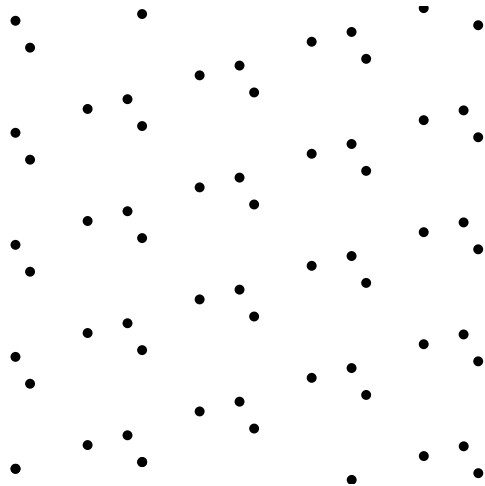
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Input:

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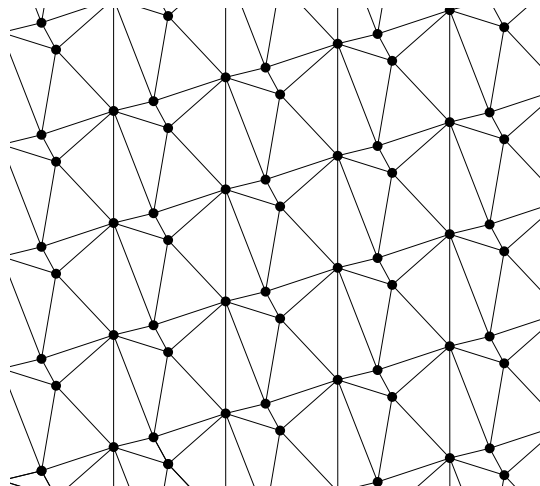
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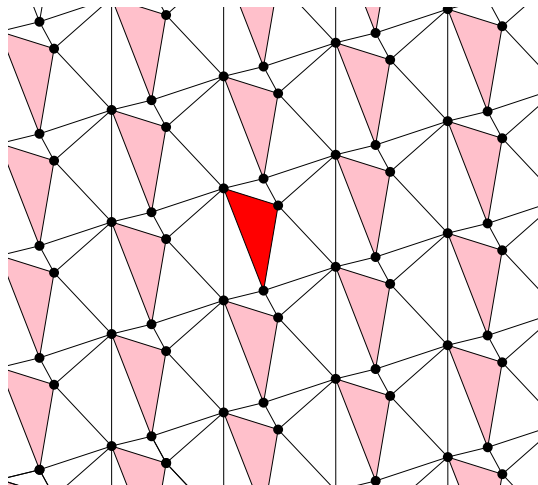
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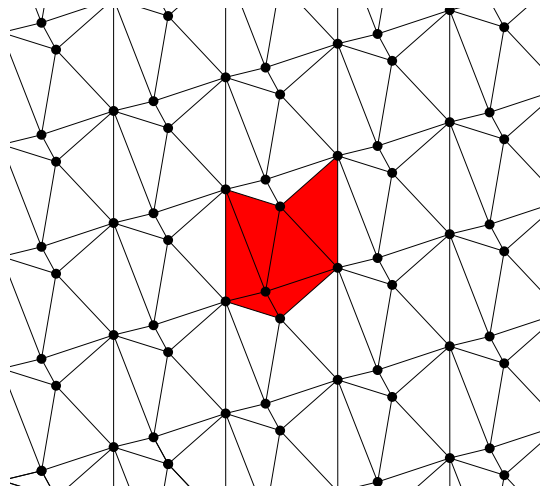
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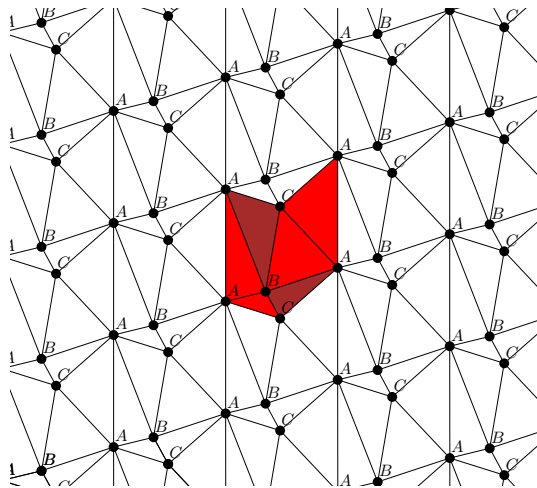
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- with vertex translation information

# Applications

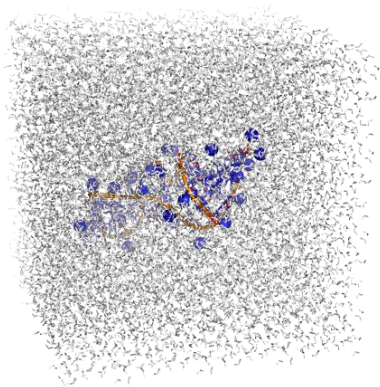


Image courtesy of Julie Bernauer

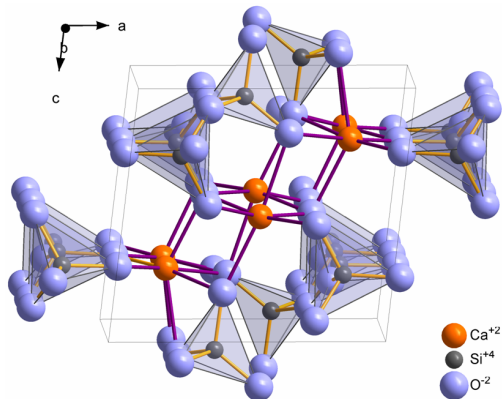


Image by Solid State, created with Diamond 3.1, CC BY-SA 3.0,  
<https://commons.wikimedia.org/w/index.php?curid=841165>

1 Setting

2 Periodic triangulations in CGAL

3 Generalization

4 Detailed Steps

5 Experimental results

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⇒ Goal: provide similar user interface for generic case

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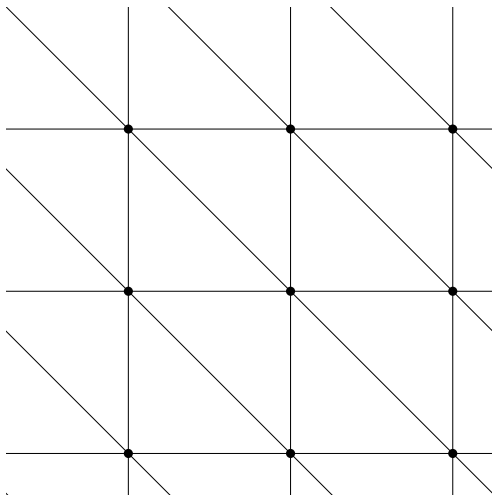
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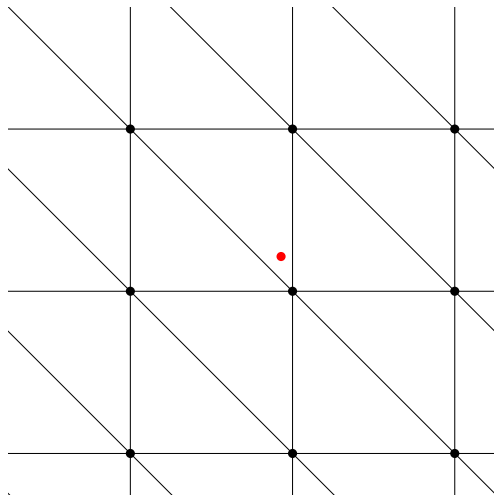
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  - initially  $3^d$  copies of everything
  - after certain criterion met, 1 copy of everything

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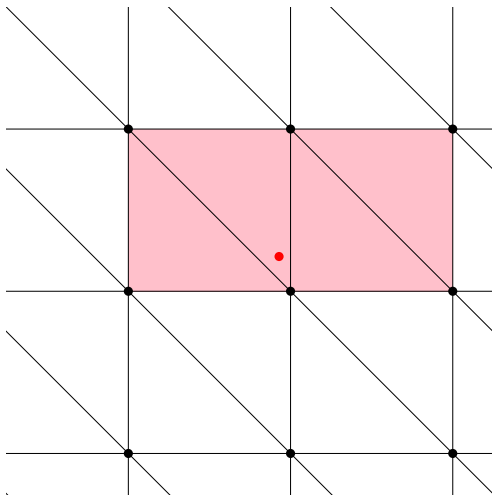




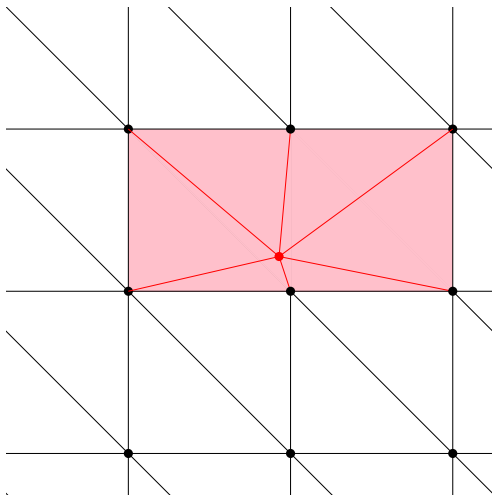
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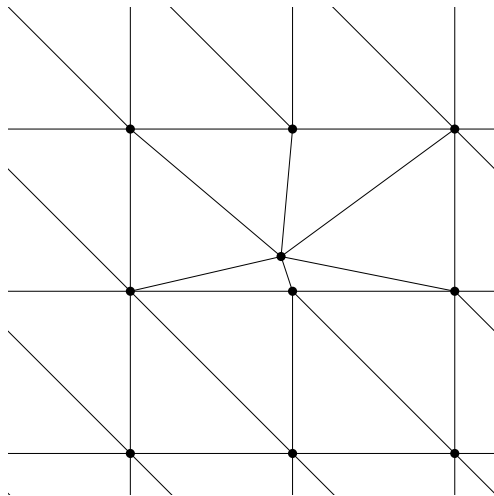
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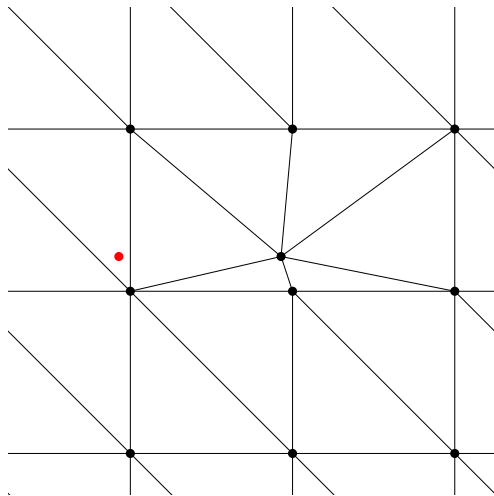
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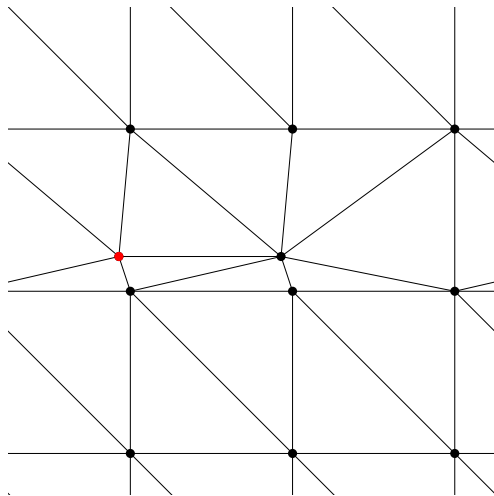
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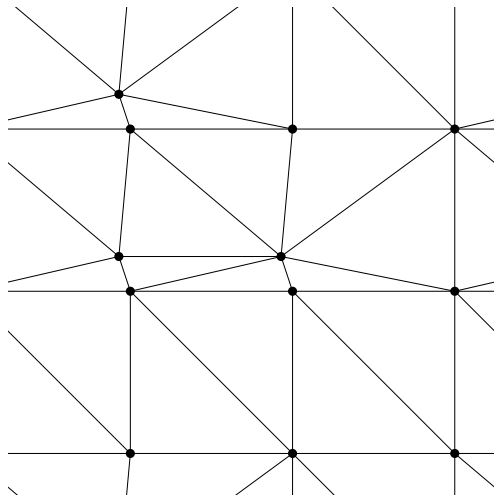
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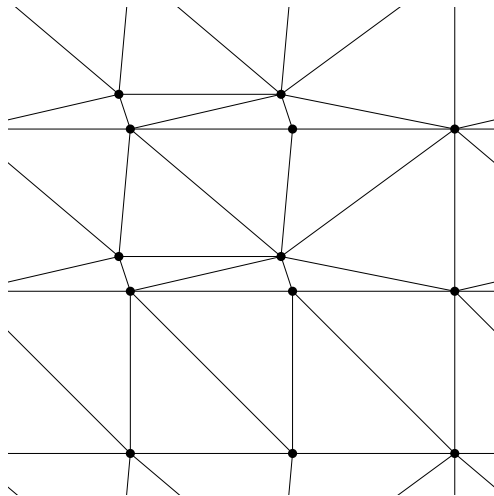
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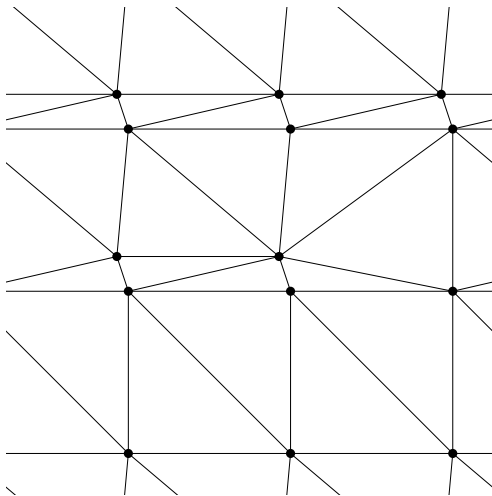


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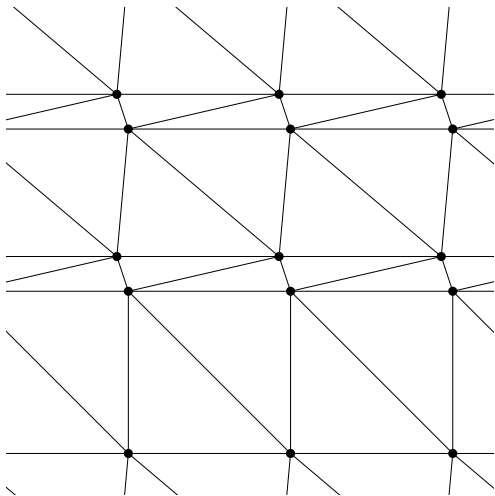




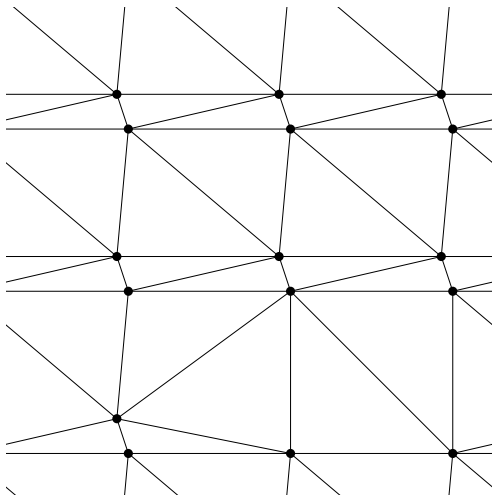
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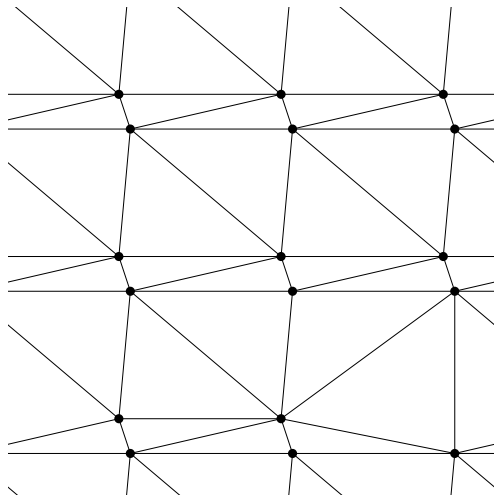
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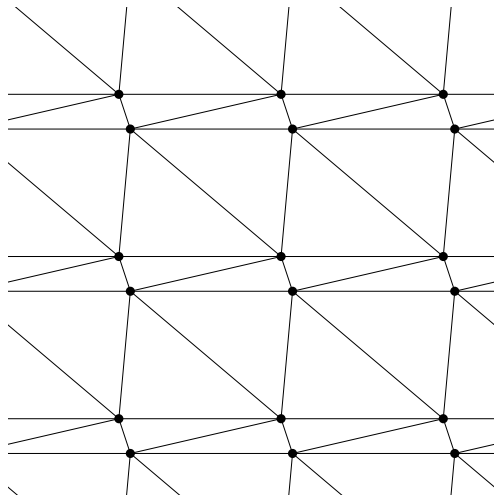
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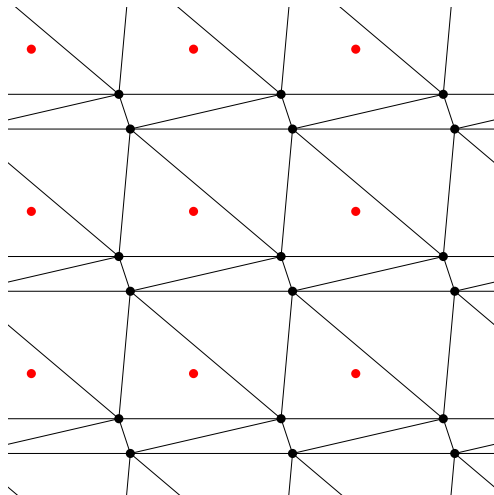
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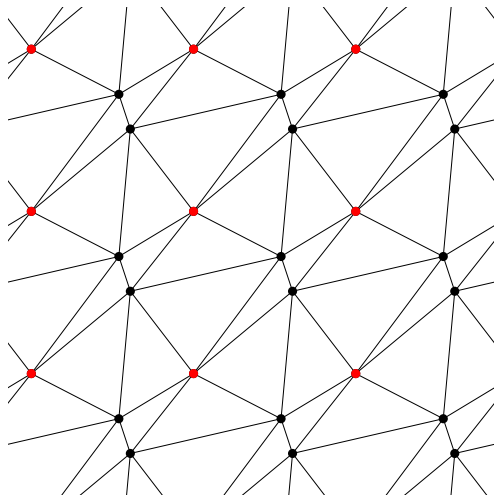
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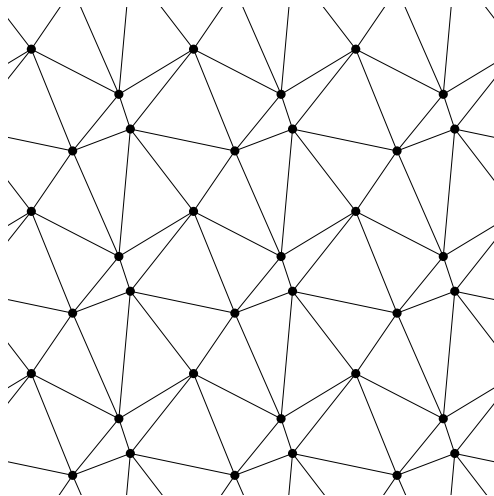
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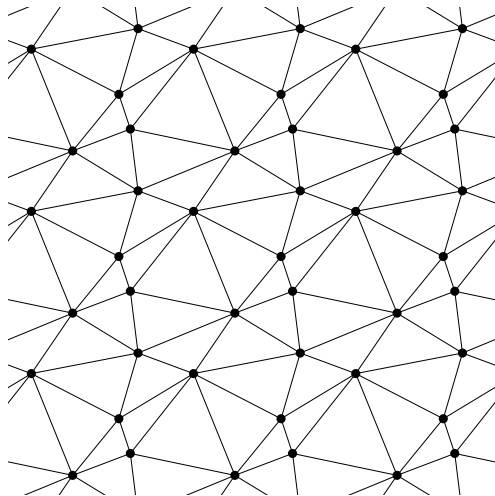


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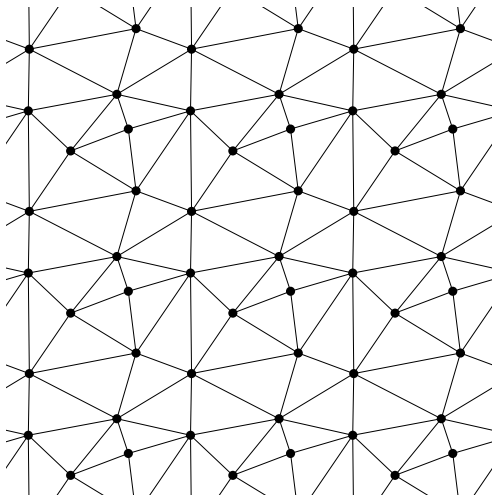




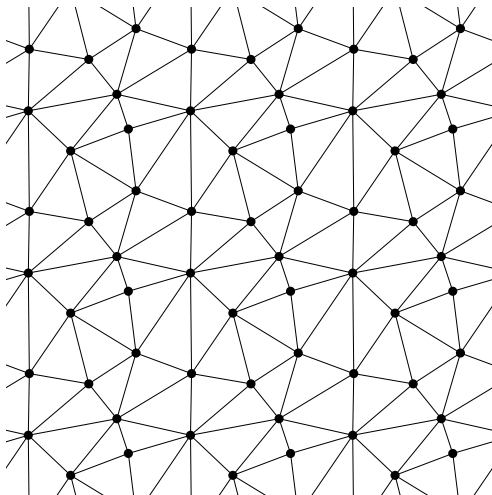
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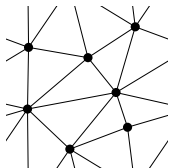
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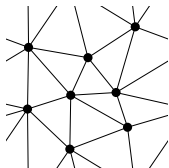
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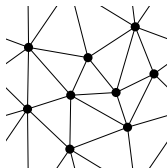
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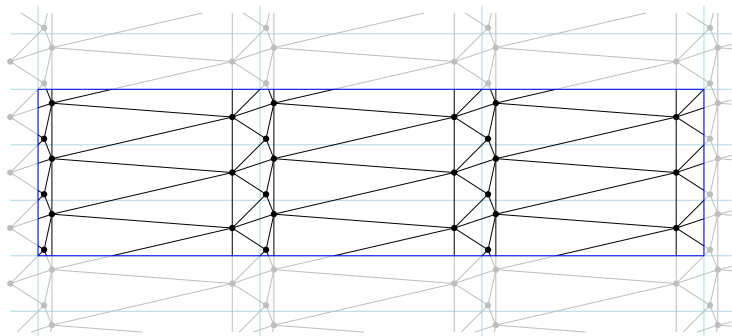
# Current CGAL implementation



- 1 Setting
- 2 Periodic triangulations in CGAL
- 3 Generalization**
- 4 Detailed Steps
- 5 Experimental results

# Generalization

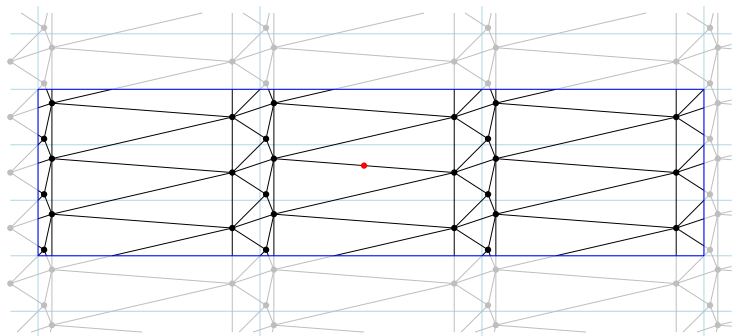
- Approach does not directly generalize
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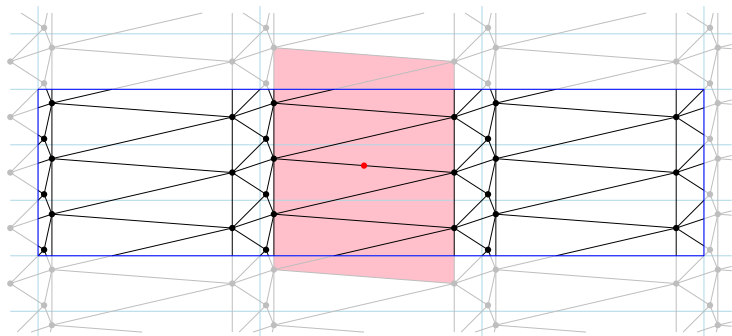
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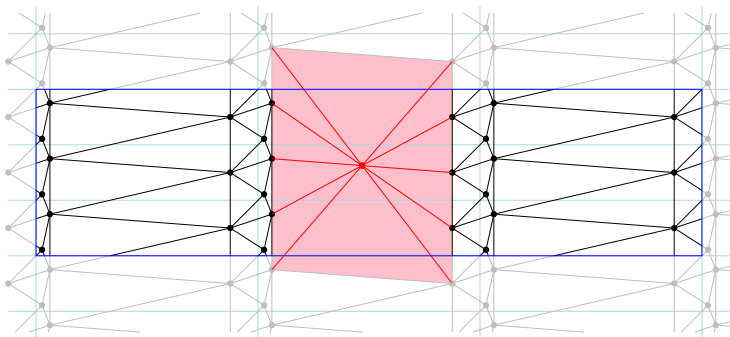
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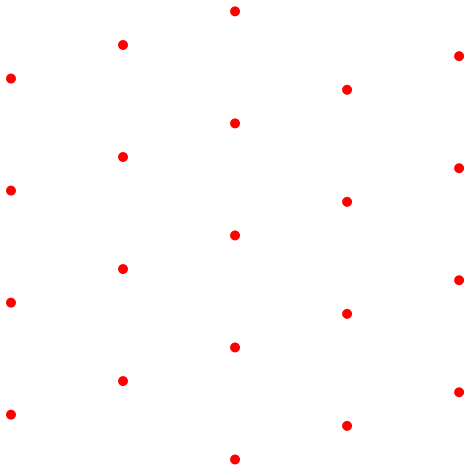


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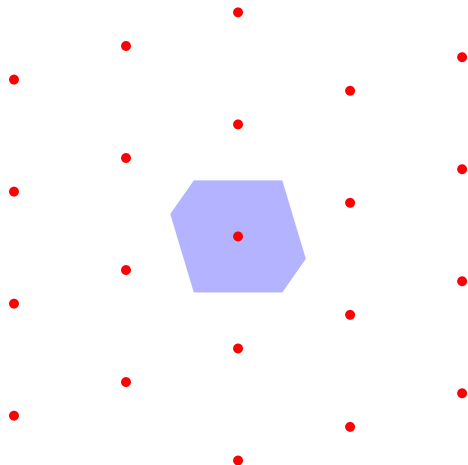
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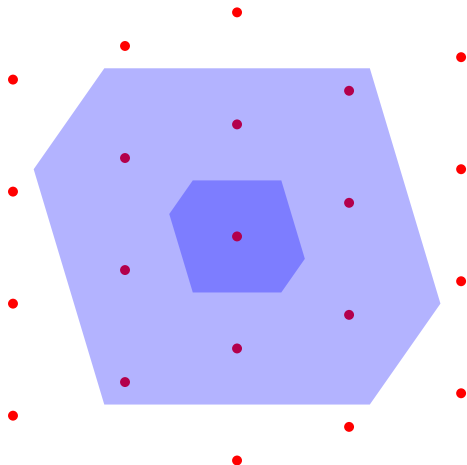


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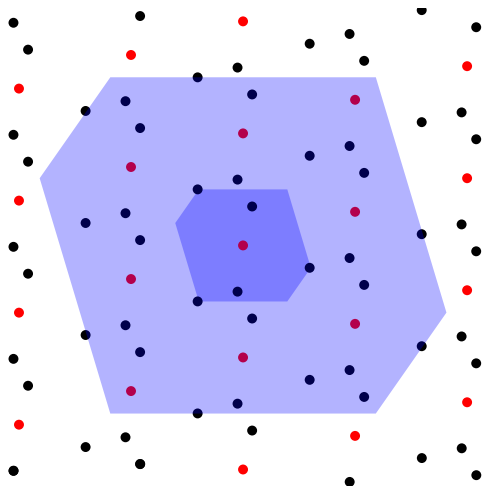
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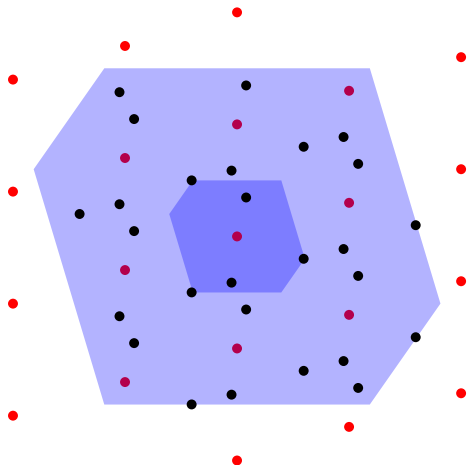
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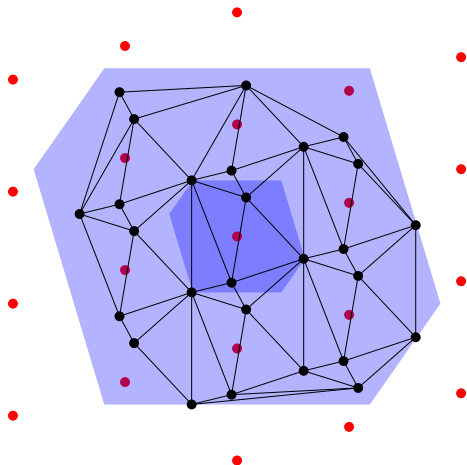
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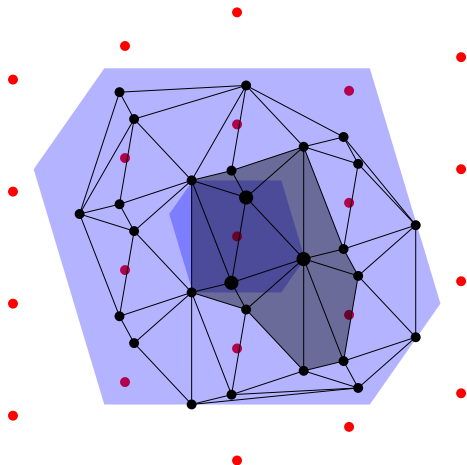


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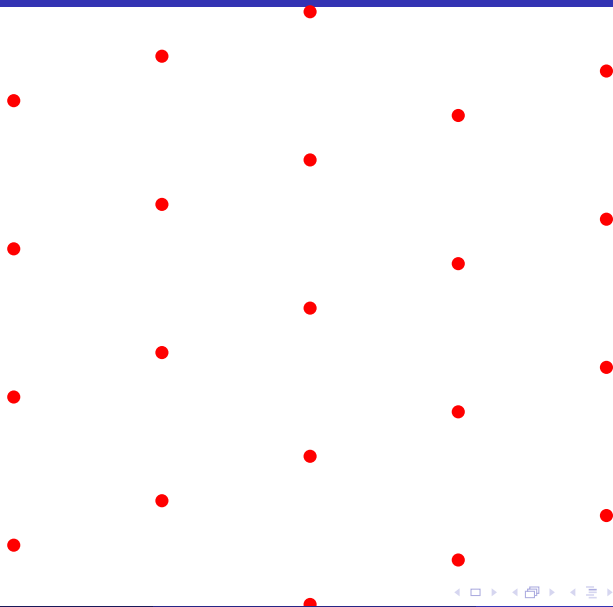
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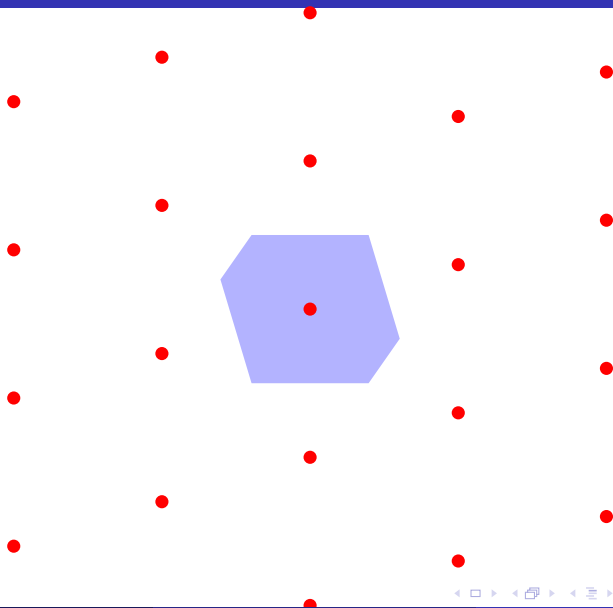
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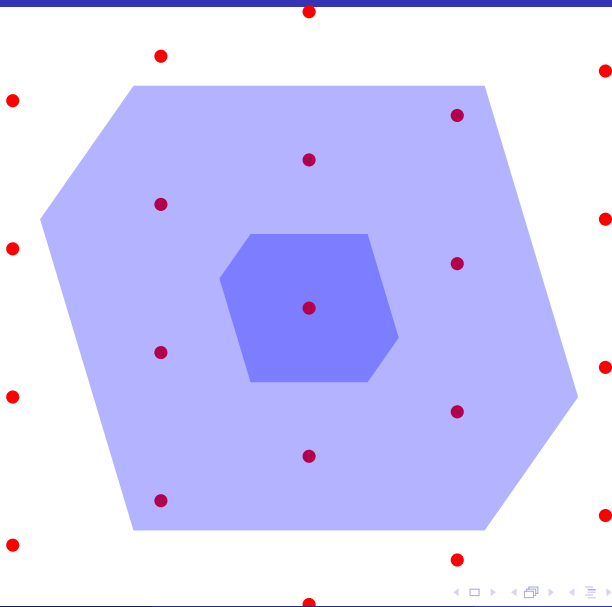
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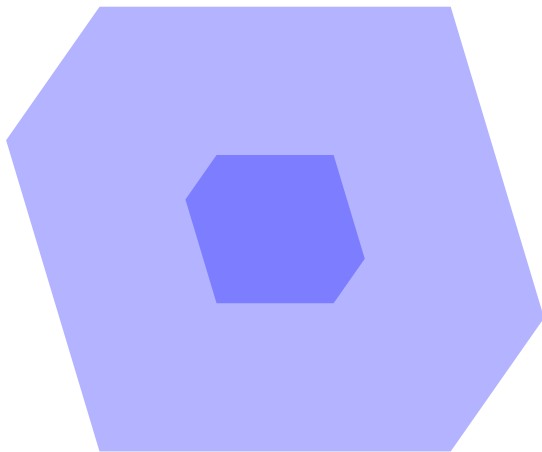
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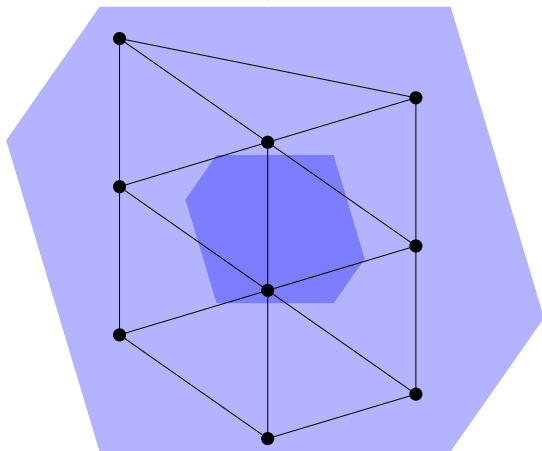
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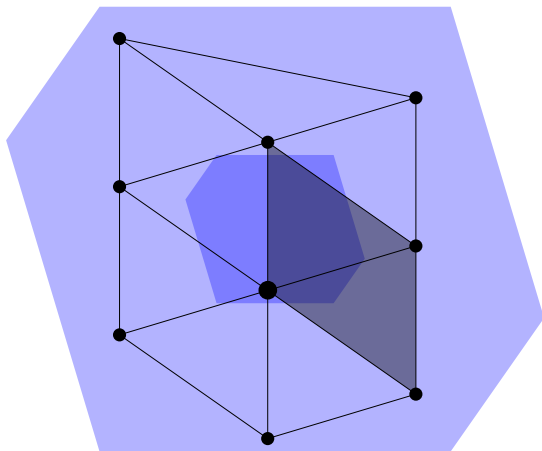
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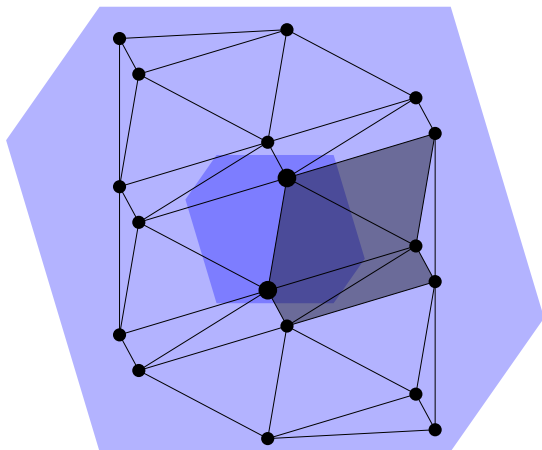
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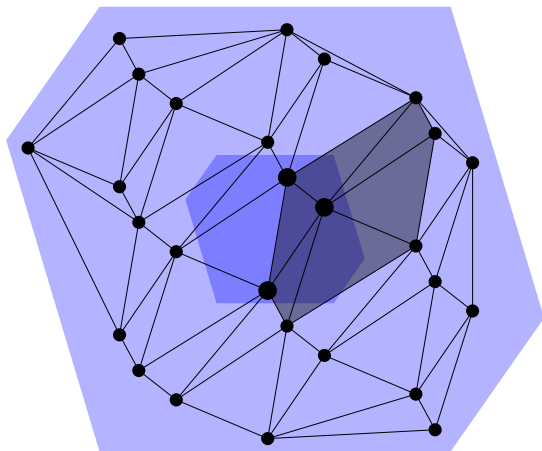
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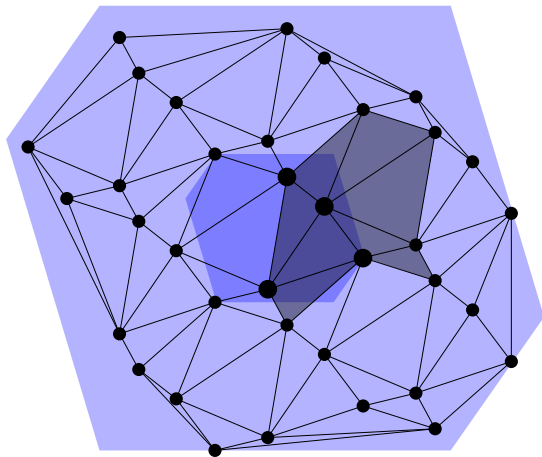


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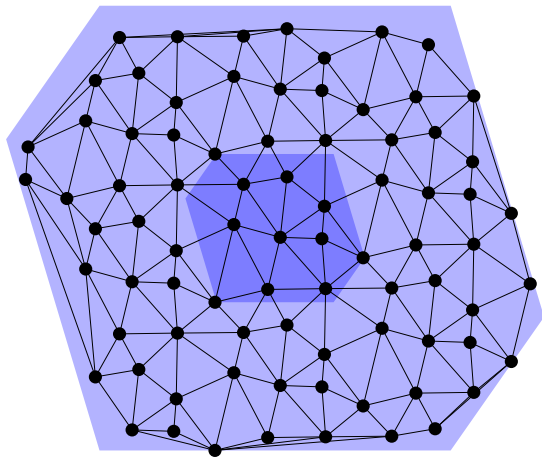




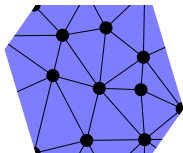
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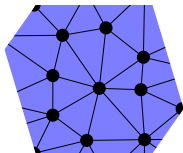
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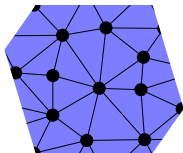
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Computing the *canonical* point copy in  $\text{dom}(0, \Lambda)$ :

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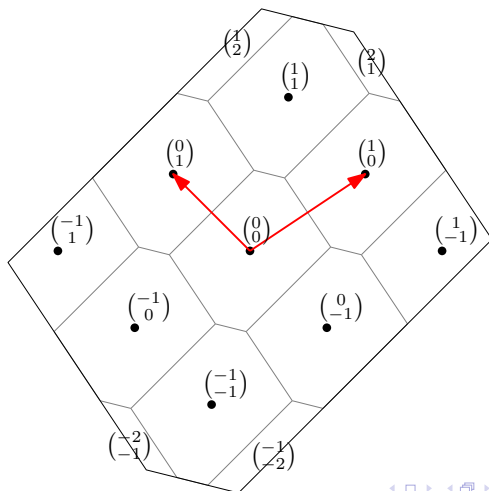
Computing all point copies in scaled domain  $\text{dom}(0, 3\Lambda)$ :

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- check translated point for containment in  $\text{dom}(0, 3\Lambda)$



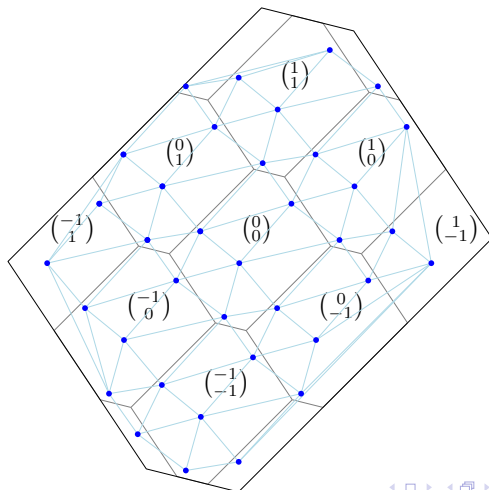
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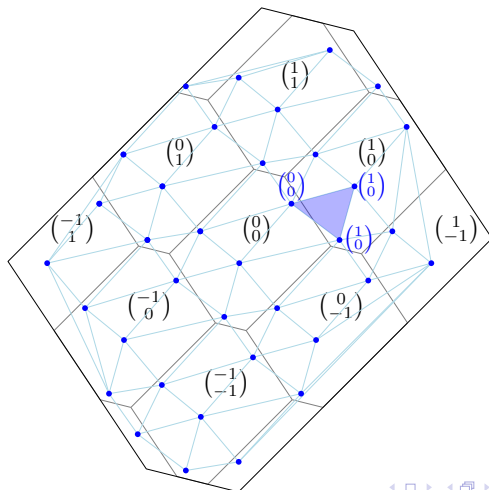
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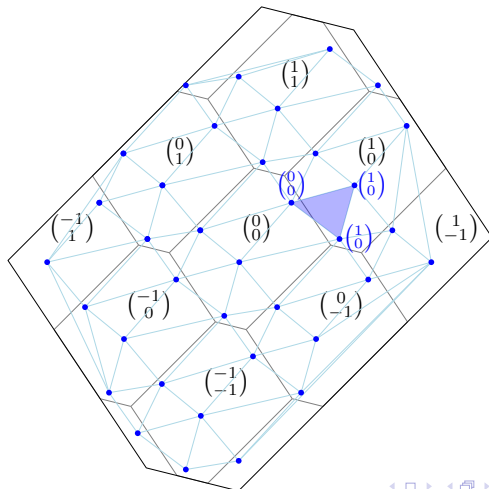
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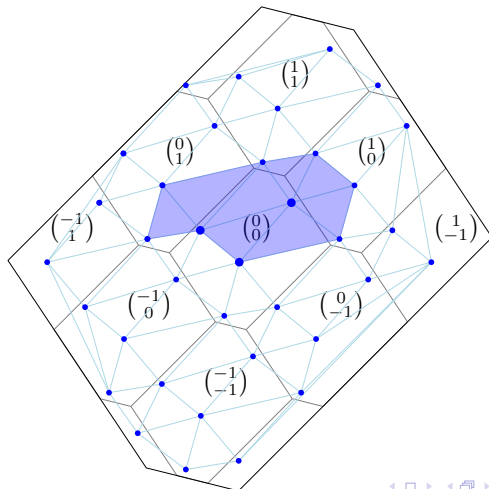
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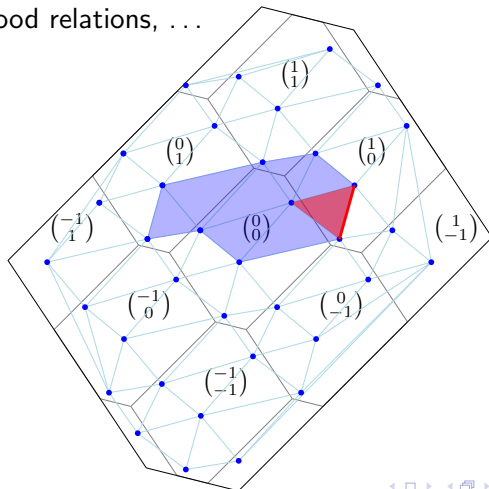
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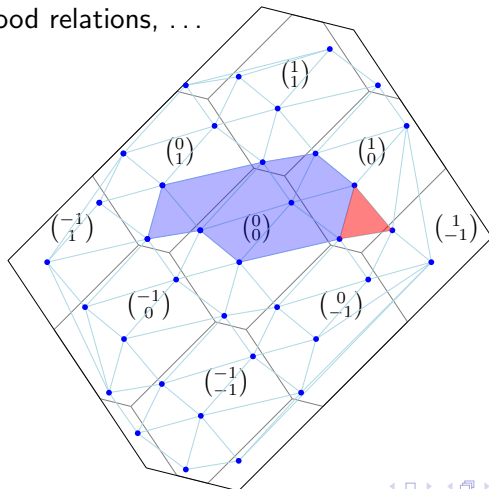
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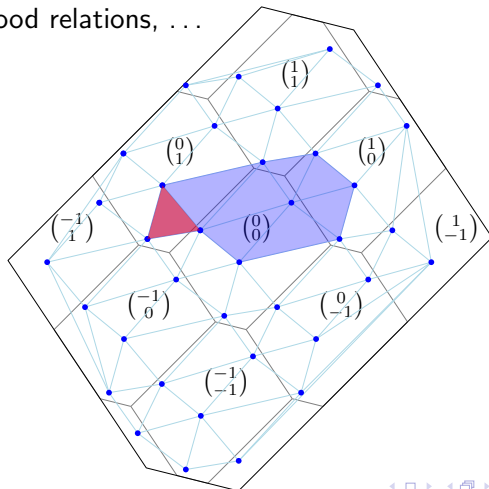
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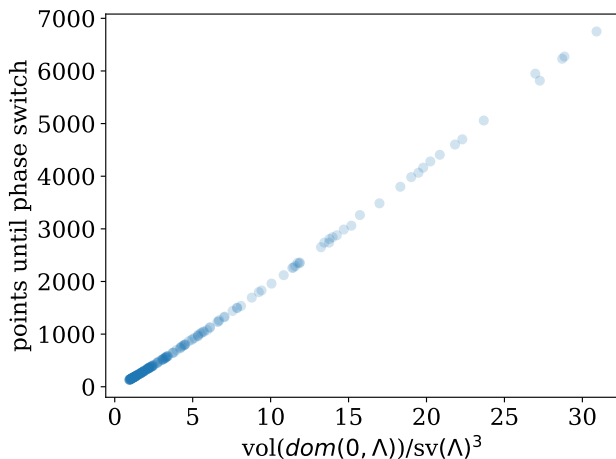
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Number of points until transition:

- depends on shape of Voronoi domain
- in practice: earlier transition if points evenly distributed

- 1 Setting
- 2 Periodic triangulations in CGAL
- 3 Generalization
- 4 Detailed Steps
- 5 Experimental results

# Points until switch



Number of random points inserted until switching criterion is fulfilled, for various 3D lattices. Each point in the plot represents a lattice.

# Running times (cubic case)

Implementation	CGAL Euclidean	CGAL Cubic	Lattice (new)
$10^0$	0.0000	0.0001	0.0002
$10^1$	0.0000	0.0160	0.0033
$10^2$	0.0004	0.1848	0.0461
$10^3$	0.0049	0.5957	0.0858
$10^4$	0.0487	0.9591	0.3832
$10^5$	0.5679	4.8119	4.5153
$10^6$	6.5974	93.9327	95.1447
$10^7$	59.5152	2314.3618	2317.7867

Running time (in seconds) of various algorithms on random point sets of various sizes with cubic periodicity.



## Running times (other lattices)

Lattice	Cubic	FCC	$\Lambda_1$	$\Lambda_2$
$\frac{\text{vol}(\text{dom}(0,\Lambda))}{\text{sv}(\Lambda)^3}$	1.0	0.71	12.5	346.41
$n_{\text{switch}}$	141	94	2519	89950
$10^0$	0.0002	0.0001	0.0003	0.0004
$10^1$	0.0033	0.0026	0.0044	0.0035
$10^2$	0.0461	0.0287	0.0460	0.0380
$10^3$	0.0858	0.0446	0.9812	0.6372
$10^4$	0.3832	0.1642	4.6602	16.5759
$10^5$	4.5153	2.7868	10.8139	362.7956
$10^6$	95.1447	51.5945	58.1568	517.9715
$10^7$	2317.7867	1215.2648	1799.4515	2983.0943

Running times (in seconds) of our algorithm for random point sets of various sizes and various lattices.

$n_{\text{switch}}$ : average number of points until switch to phase 2

# Summary

- periodic 2D and 3D Delaunay triangulations for arbitrary lattices within branch of CGAL codebase, aim to integrate into CGAL
- performance comparable to CGAL implementation for cubic lattice
- internally operates in 2 phases
  - Phase 1: Euclidean triangulation with  $3^d$  copies of each point
  - Phase 2: Periodic triangulation with 1 copy of each point
  - Transition once sufficiently many points inserted
- provides uniform interface to periodic triangulation (e.g. iterators, adjacency relations) that hides the internal phase