

How We Solve CG:SHOP Problems

Guilherme D. da Fonseca – LIS, Aix-Marseille Université

Yan Gerard – LIMOS, Université Clermont Auvergne

+ All Shadoks team members



Shadoks

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Two Phases

1-Greedy

MaxPolygon

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Coloring

1-IP

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ConvexCover

2-IP

ConvexCover

ConvexPartition

2-Local

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2-Conflict

Robots

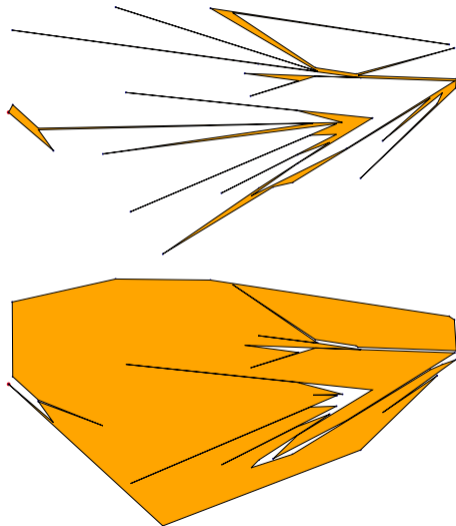
Coloring

Some results

- Part of SoCG (International Symposium on Computational Geometry)
- Annual event that started in 2018–2019
- Hard geometric optimization problems
- Different problem each year
- ~ 200 instances given
- ~ 3 months to compute solutions
- Send our solutions (not the code)
- Score based on the quality of the solutions
- Top teams invited to publish in SoCG proceedings and ACM Journal of Experimental Algorithmics or Computing in Geometry and Topology

Minimum (or Maximum) Area Polygon:

- Input: A set of points $S \subset \mathbb{R}^2$
 - Output: A simple polygon with vertex set S
 - Goal: Minimize (or maximize) the area
-
- Related to Euclidean TSP
 - Two categories: minimization, maximization
 - We got 2nd place
 - Techniques: greedy and local search



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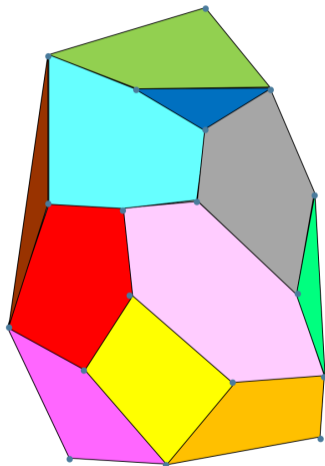
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Minimum Convex Partition:

- Input: A set of points $S \subset \mathbb{R}^2$
 - Output: A simple partition of the convex hull of S into convex regions with vertex set S
 - Goal: Minimize the number of regions
-
- We got 4th place
 - Used integer programming



11 convex regions

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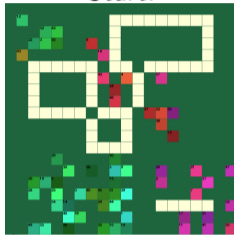
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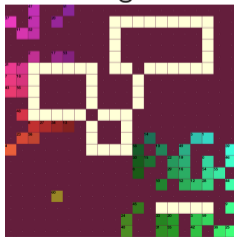
Coordinated Motion Planning:

- Input: Sets $S, T \subset \mathbb{Z}^2$ of start and target locations for n robots and possibly a set of obstacles
 - Output: A sequence of movements for all robots from start to target avoiding collisions
 - Goal: Minimize the total time (makespan) or the total number of movements (energy)
-
- 1st place in makespan category, 3rd place in energy category
 - Used storage network and conflict optimizer

Start:

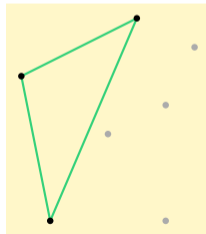
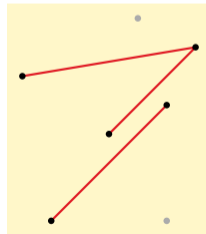
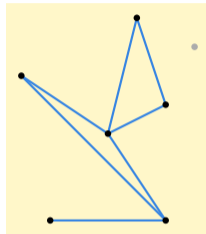
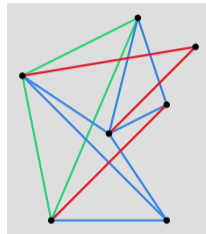


Target:



Partition Into Plane Graphs:

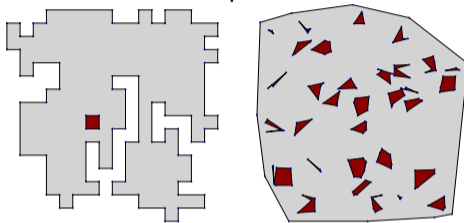
- Input: A graph G embedded in the plane with straight edges
 - Output: A partition of G into plane graphs
 - Goal: Minimize the number of partitions (colors)
-
- We won 1st place
 - Best solution of all teams to all instances
 - Optimal solution to at least 23
 - Reused conflict optimizer



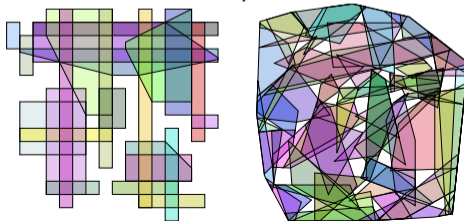
Convex Covering:

- Input: A polygon with holes P
 - Output: A collection of convex polygons whose union is P
 - Goal: Minimize the number of convex polygons
-
- We won 2nd place
 - Best solution among all teams to 128 of 206 instances
 - Used integer programming and simulated annealing

Input



Output



Knapsack Translational Packing:

- Input: A convex polygon (*container*) and a multi-set of polygons with *values* (*items*)
 - Output: A translation of some items that form a packing inside the container
 - Goal: Maximize the sum of the values in the output
-
- We won 1st place
 - Used greedy, local search, and integer programming



- Our strategy in every competition:
 - 1 Find initial feasible solutions
 - 2 Improve them
- We've seen two types of problems:
 - The quality of the initial solution is irrelevant and the improvements are major
 - The quality of the initial solution is essential and the improvements are minor
- Hard to tell them apart
- If the solution to a subproblem can be incorporated into an existing solution, it is easier to improve

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- Greedy heuristics often produce good initial solutions:
 - 1 Choose an element to add to the solution
 - 2 Choose how to incorporate this element
 - 3 Repeat
- Good data structures to implement it efficiently
- Three examples:
 - Packing
 - Coloring
 - MaxPolygon

Greedy Maximum Area Polygon

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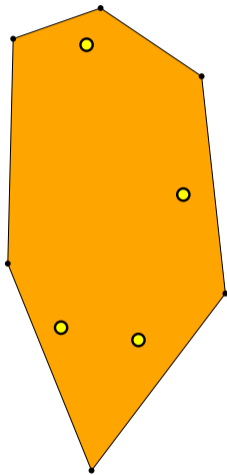
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- Choose the valid vertex-edge pair that decreases the area the least

Issues:

- Long edges block many future vertex-edge pairs
- Stall: May have no valid vertex-edge pair

Solution:

- Penalize long edges and favor breaking long edges:
$$weight(p_1, p_2, q) = area(p_1 p_2 q) + \alpha(\|qp_1\| + \|qp_2\| - \|p_1 p_2\|)$$
for small α
- Add random noise to circumvent stalls



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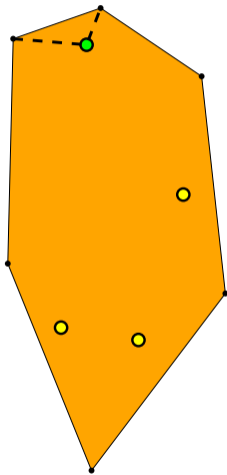
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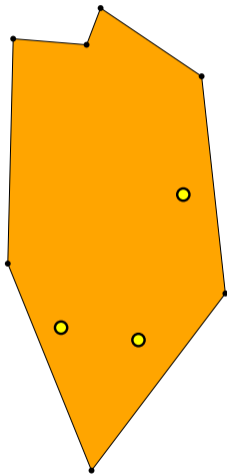
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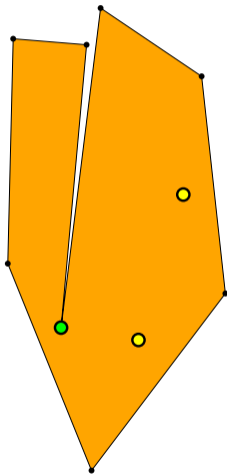
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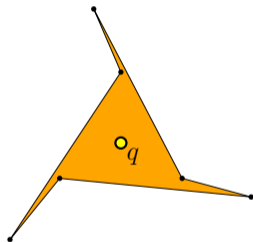
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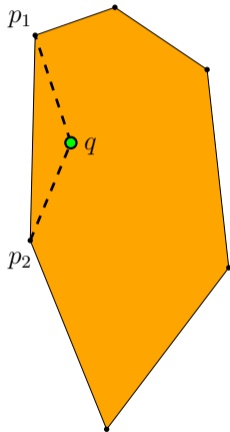
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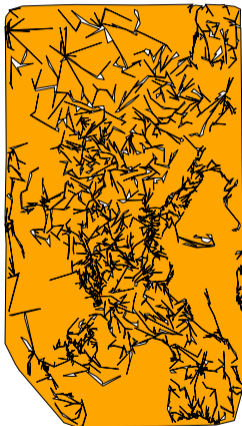
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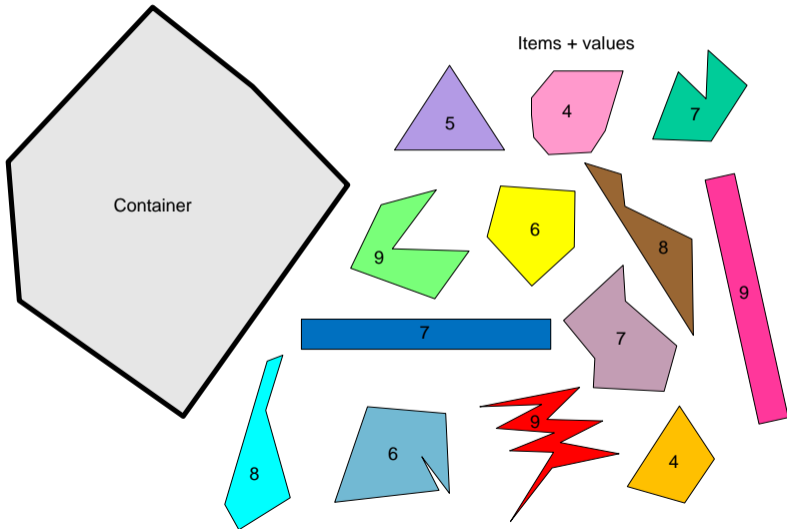
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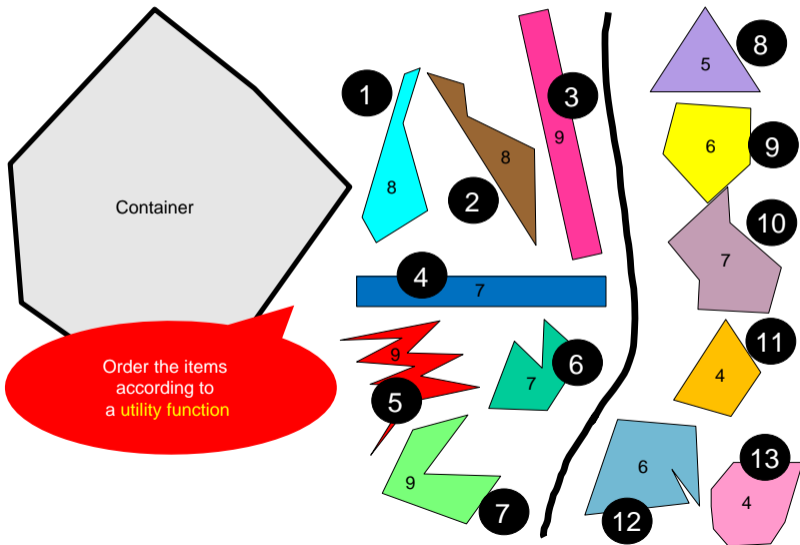
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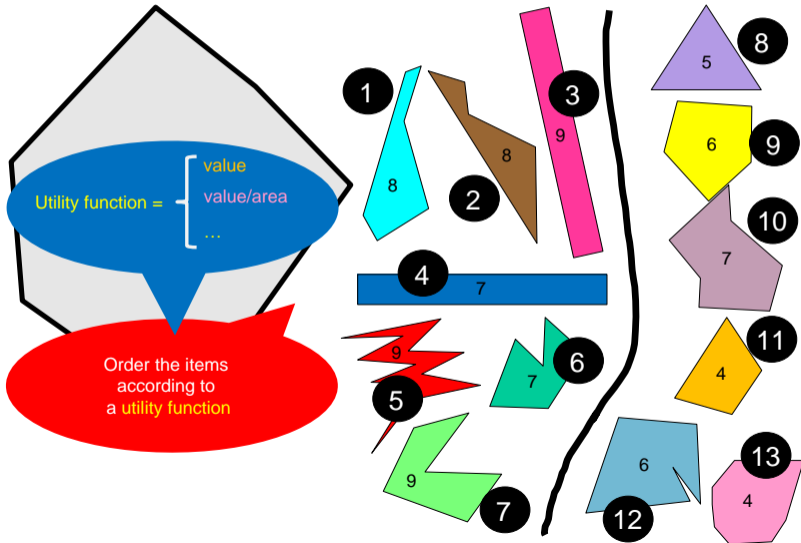
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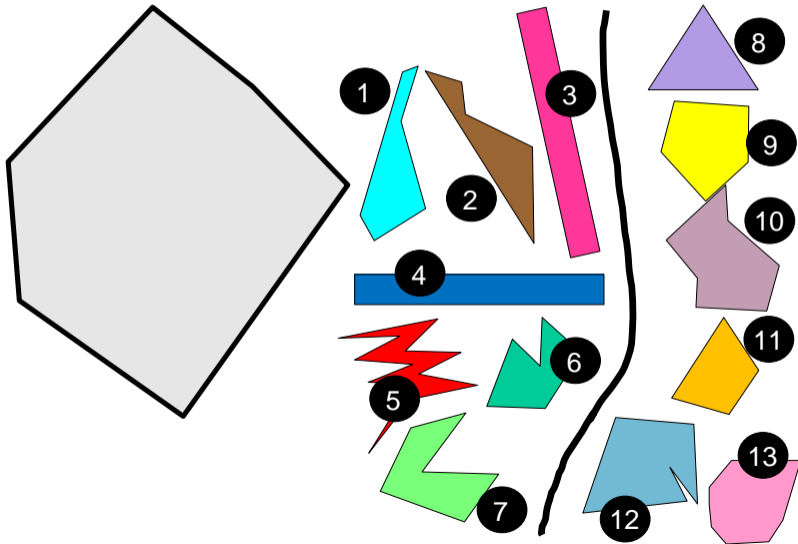
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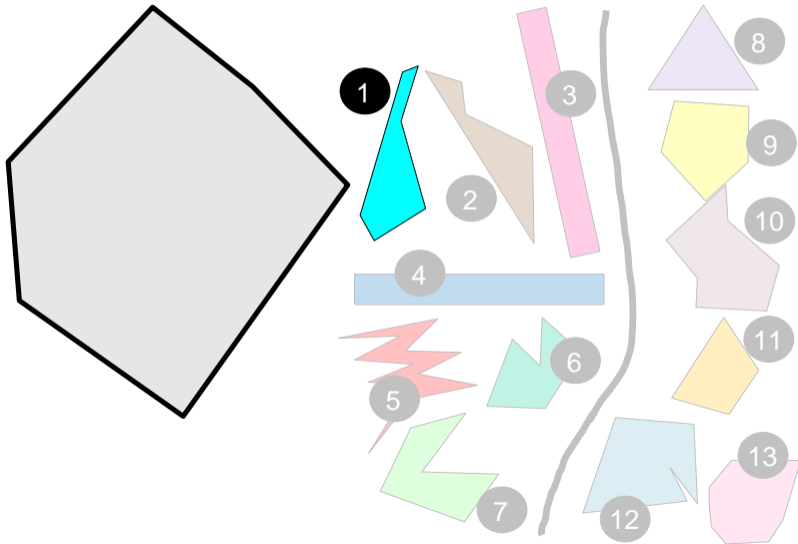
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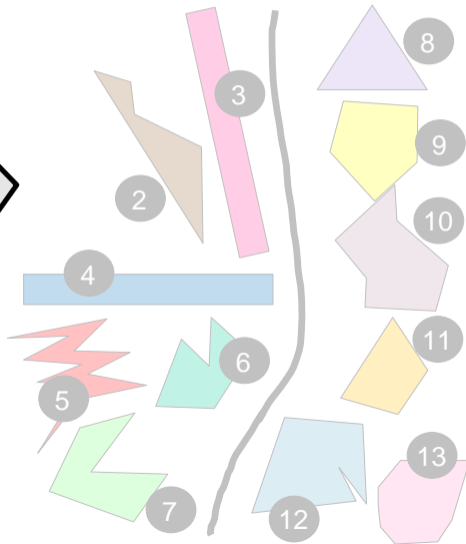
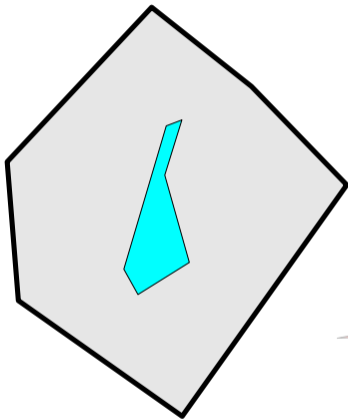
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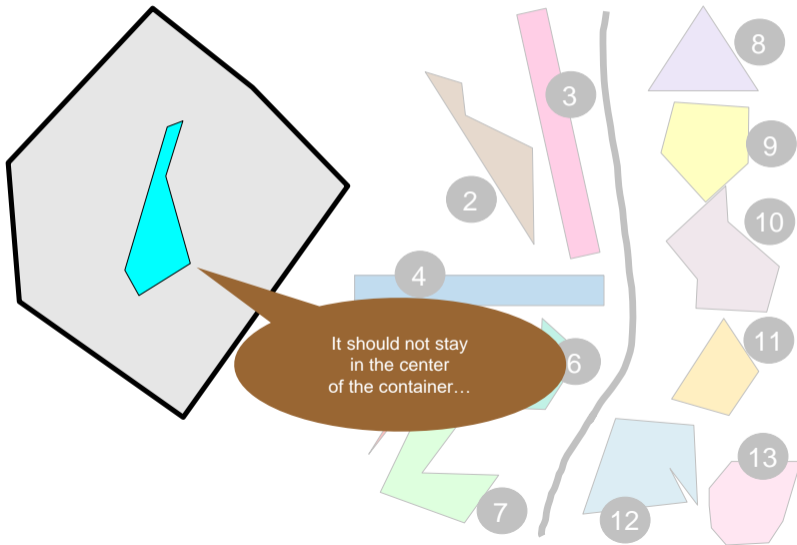
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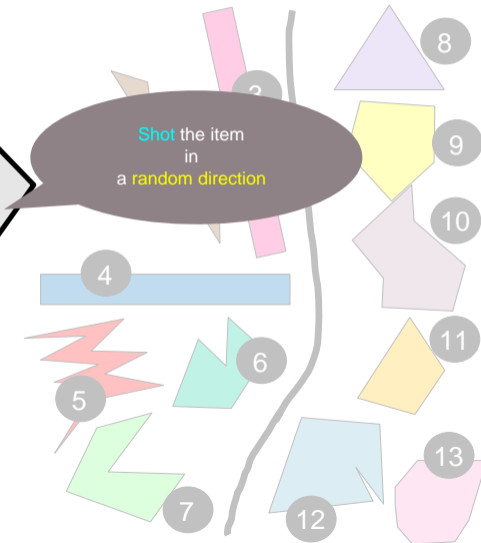
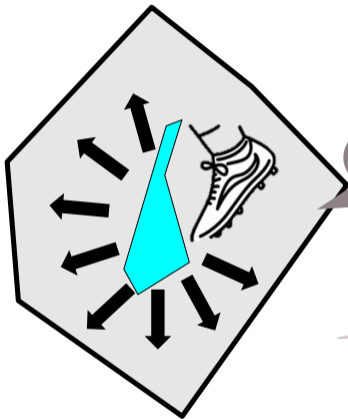
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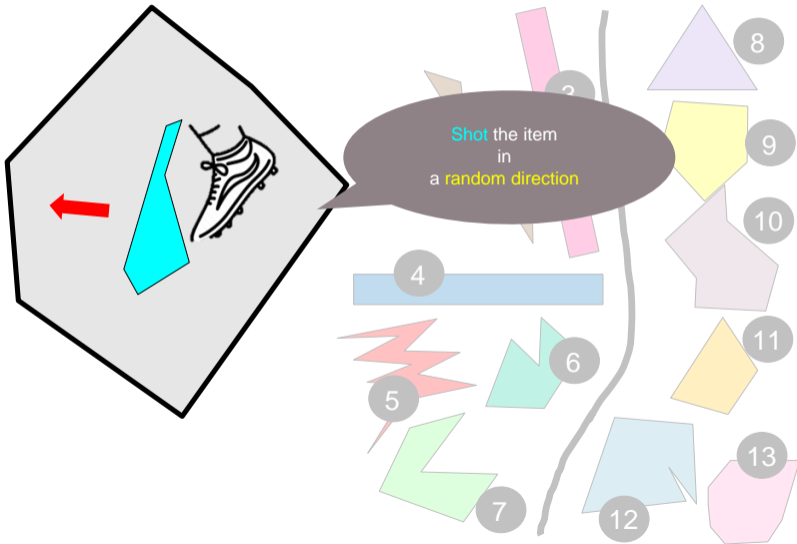
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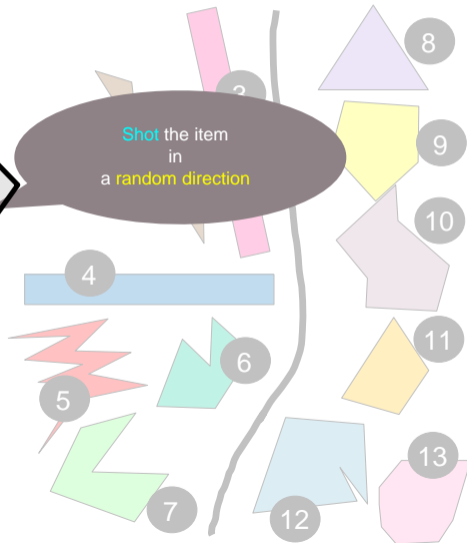
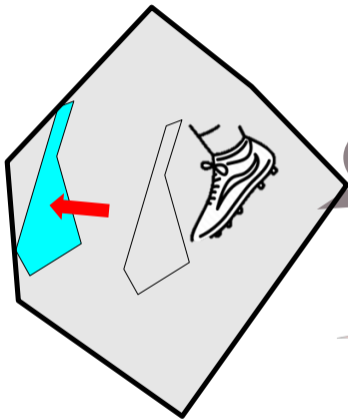
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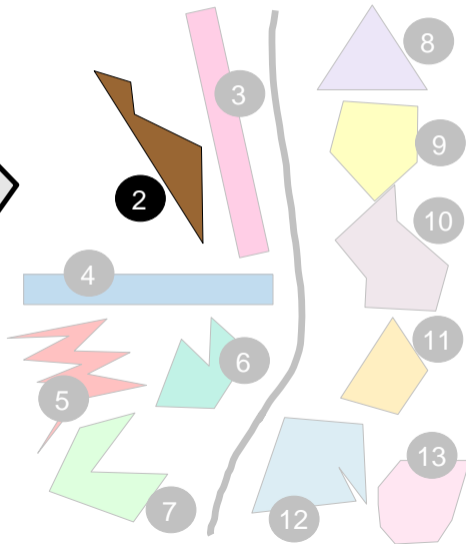
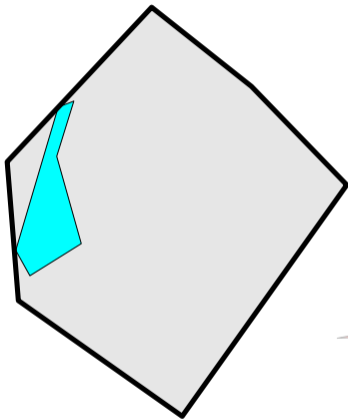
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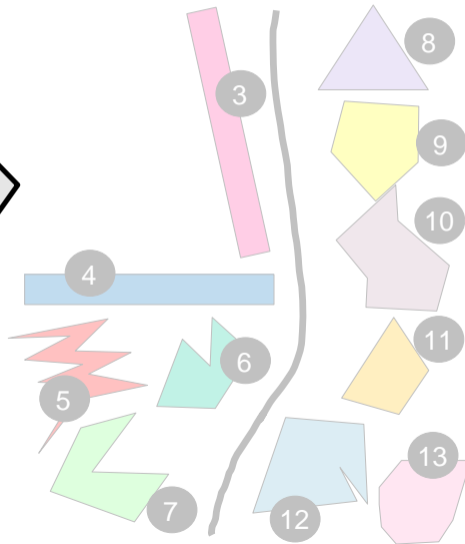
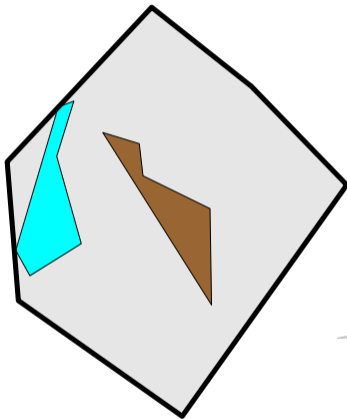
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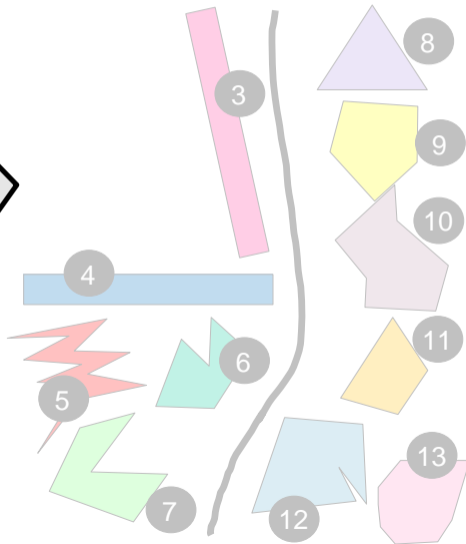
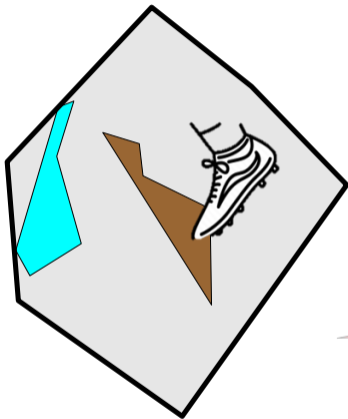
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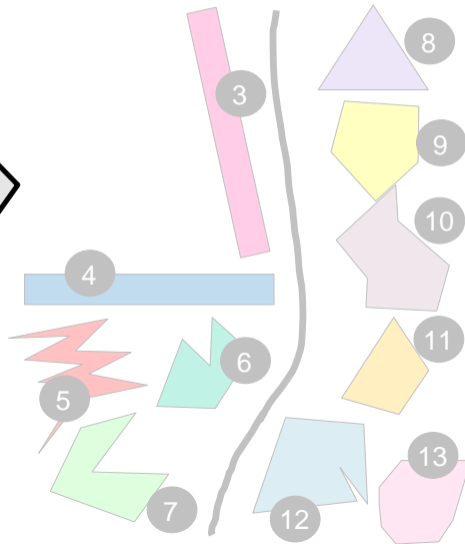
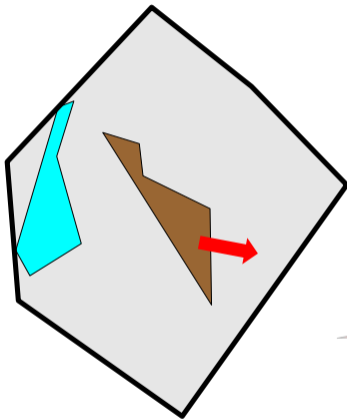
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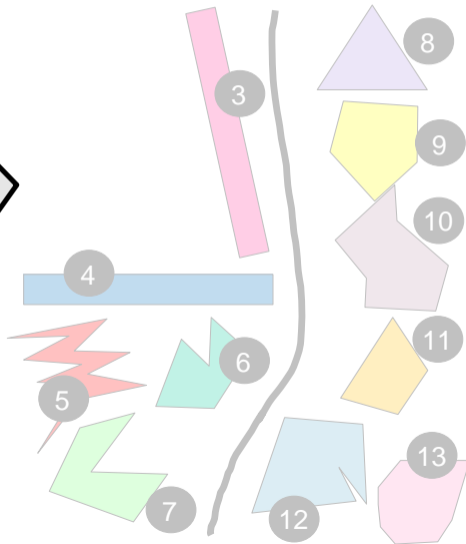
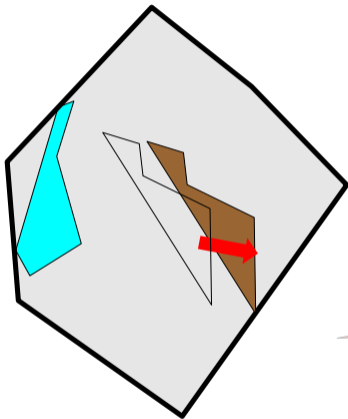
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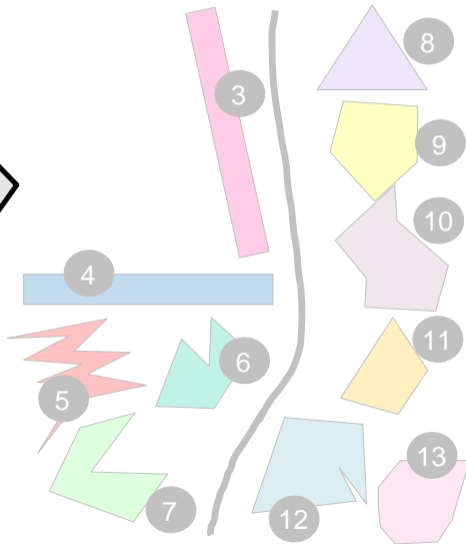
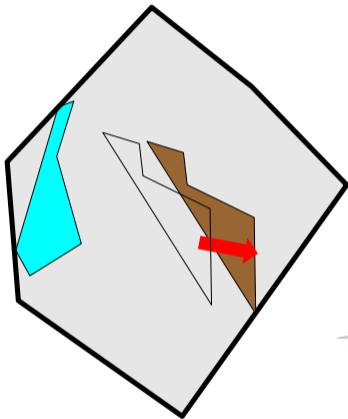
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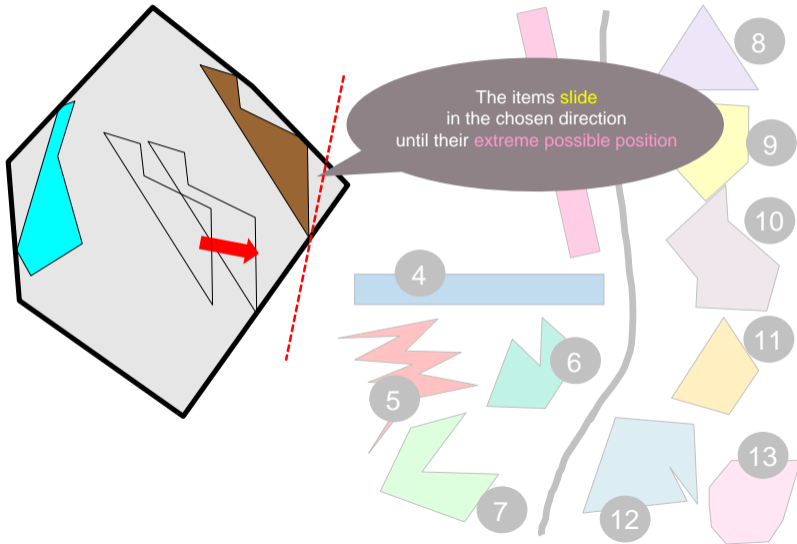
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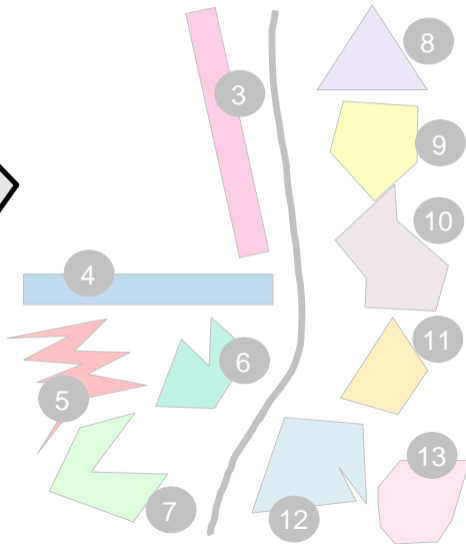
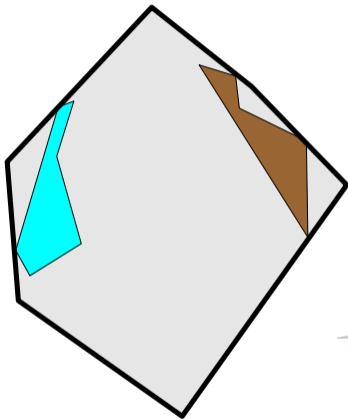
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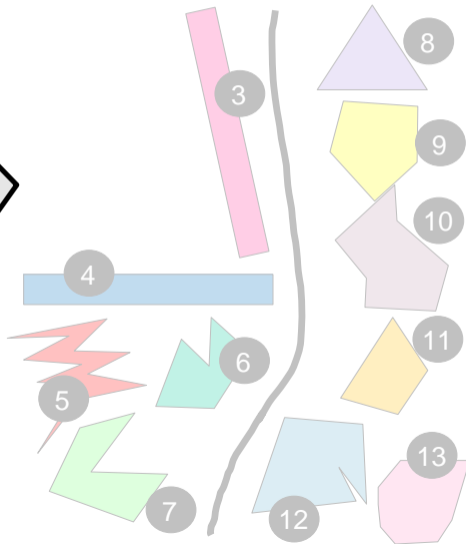
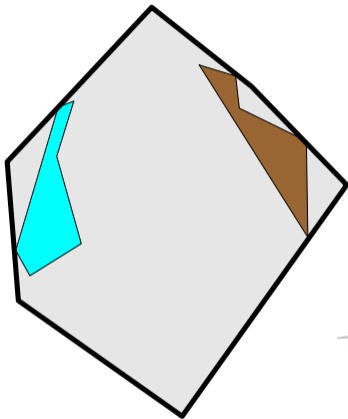
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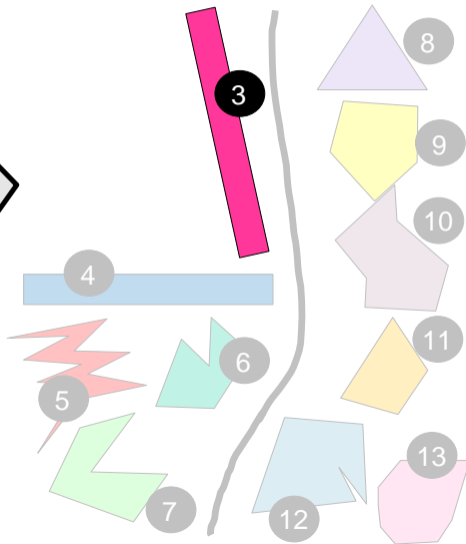
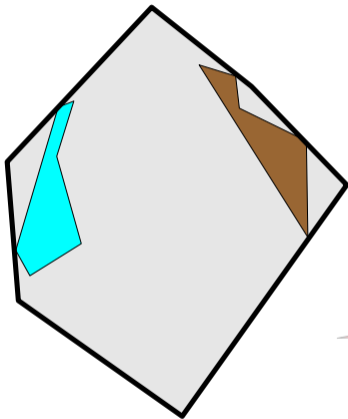
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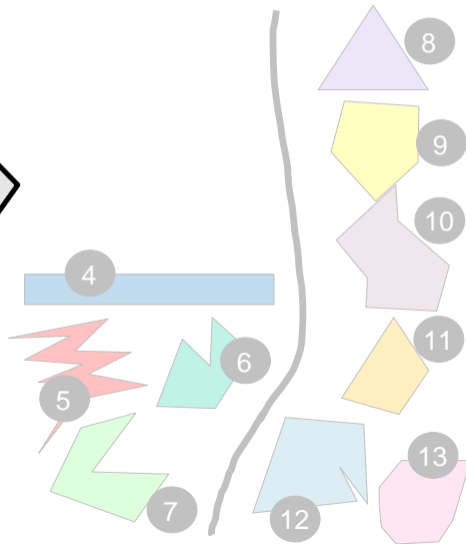
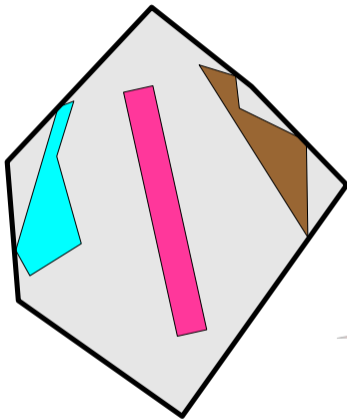
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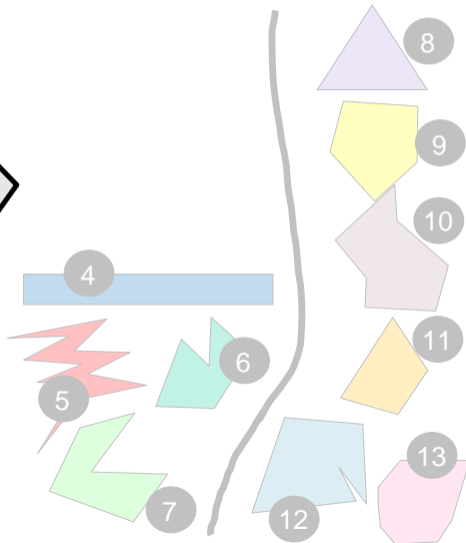
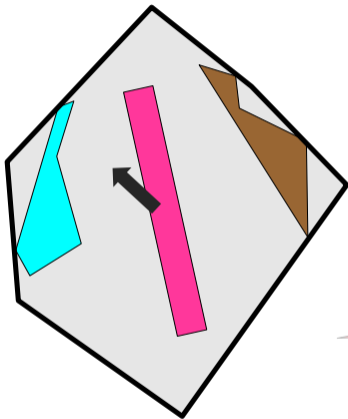
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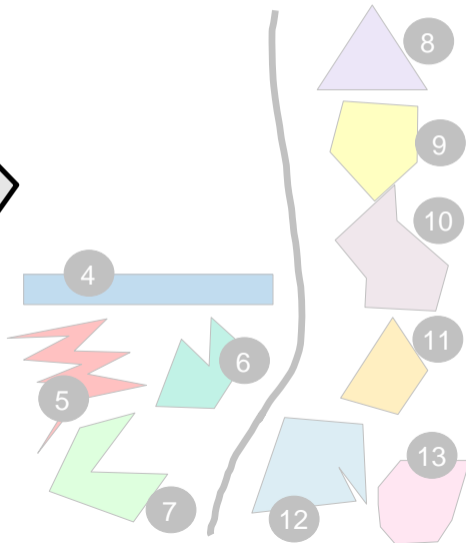
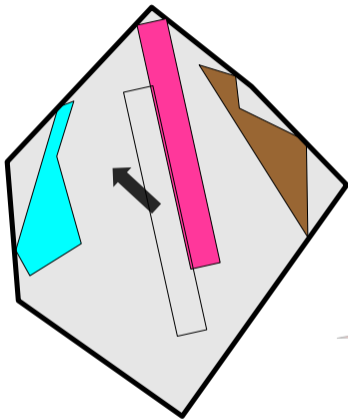
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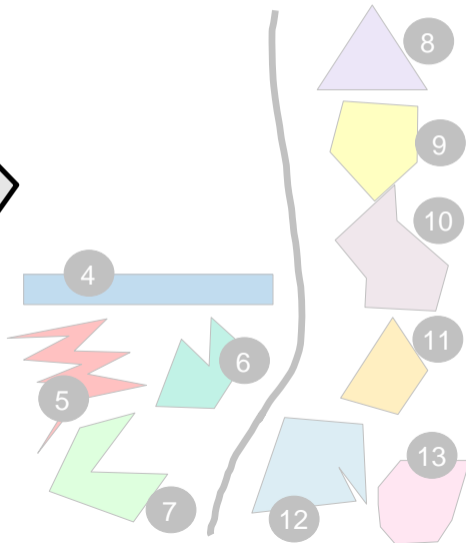
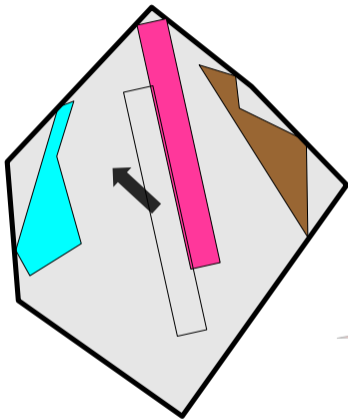
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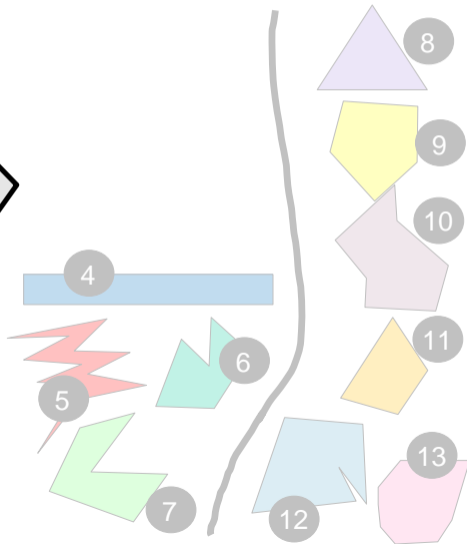
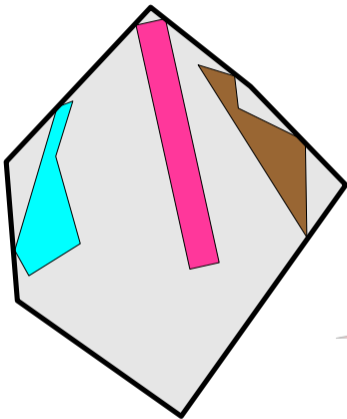
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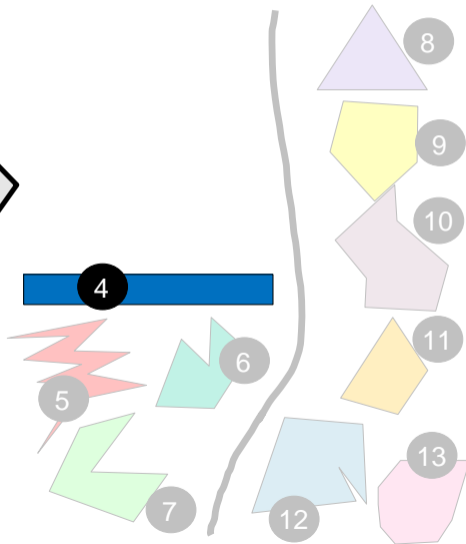
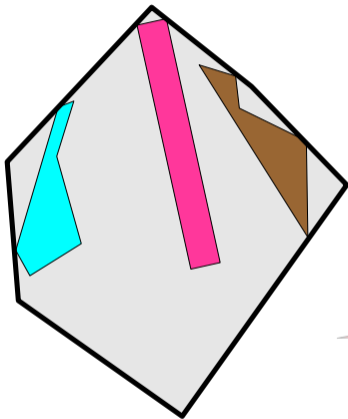
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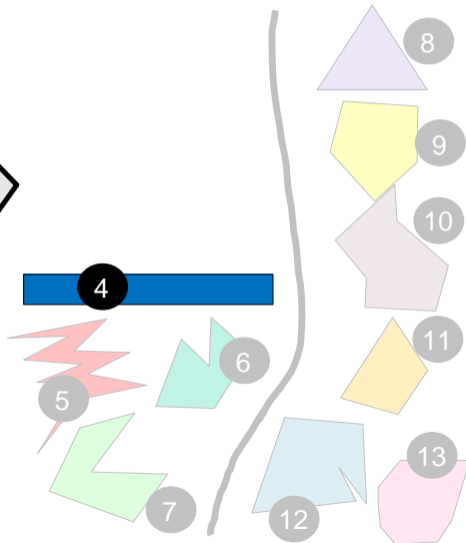
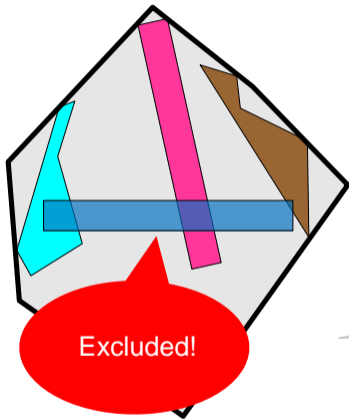
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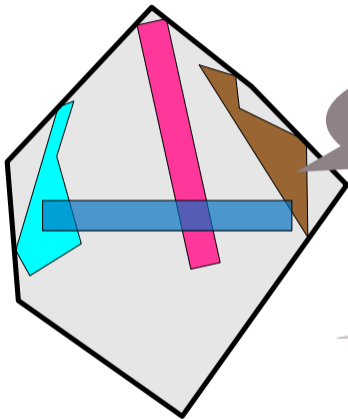
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We search among
a set of **1000 positions**
if it can be packed somewhere...



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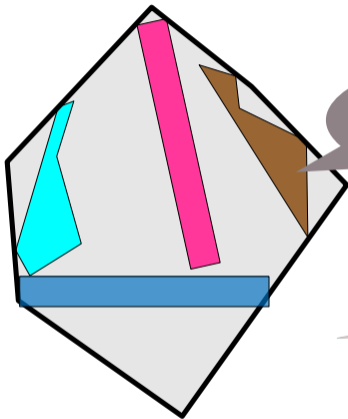
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We search among
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if it can be packed somewhere...



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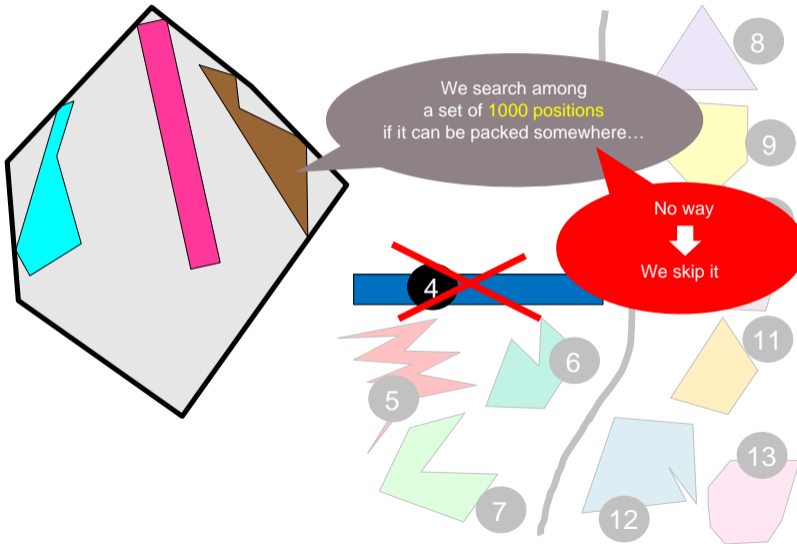
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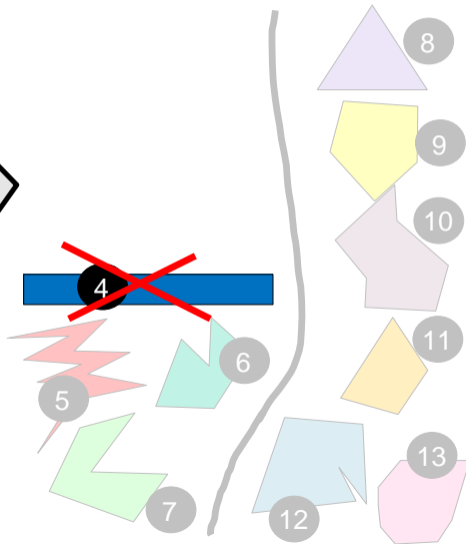
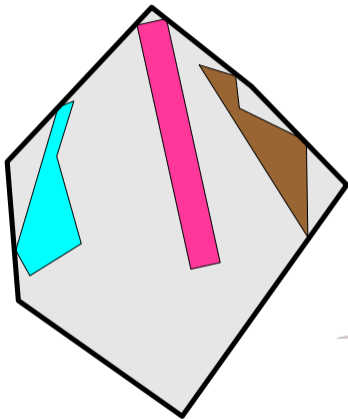
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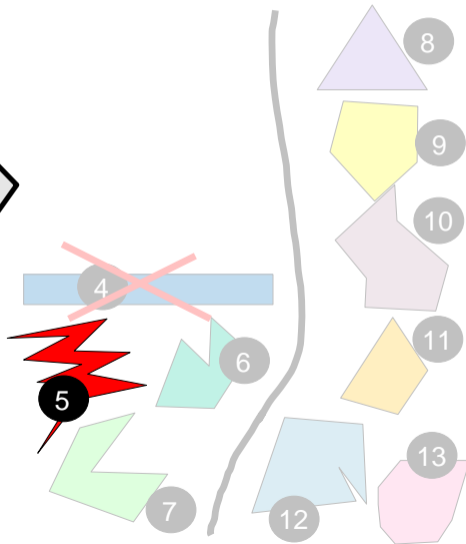
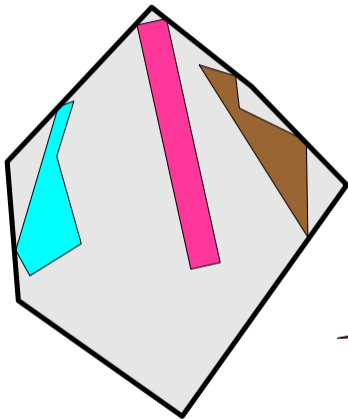
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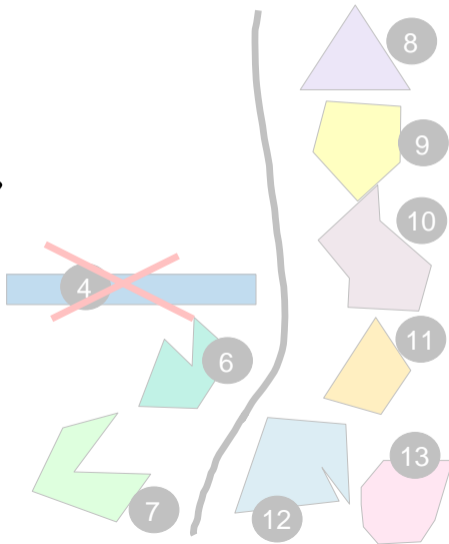
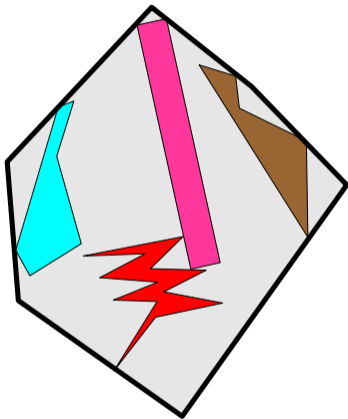
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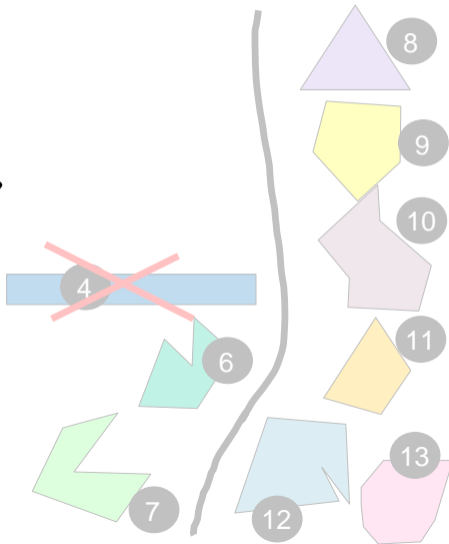
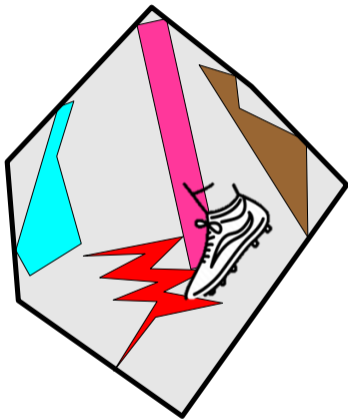
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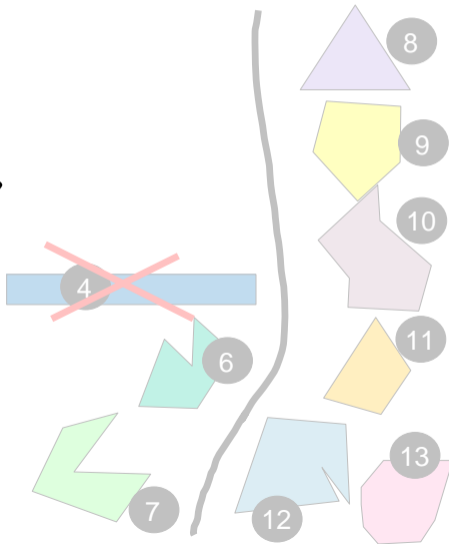
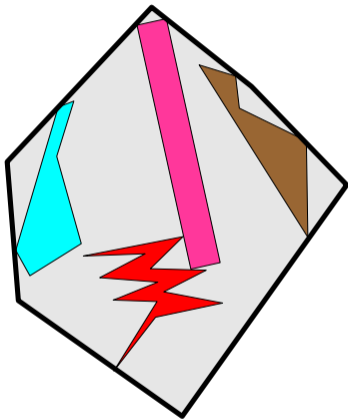
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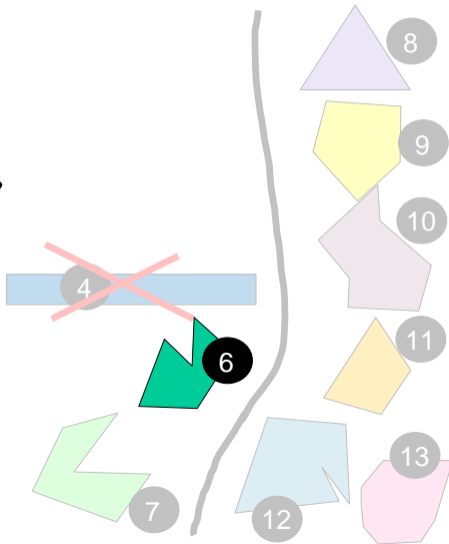
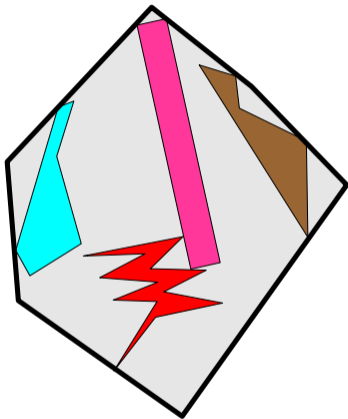
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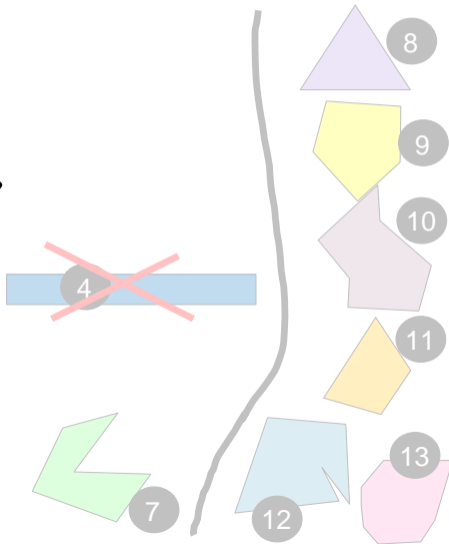
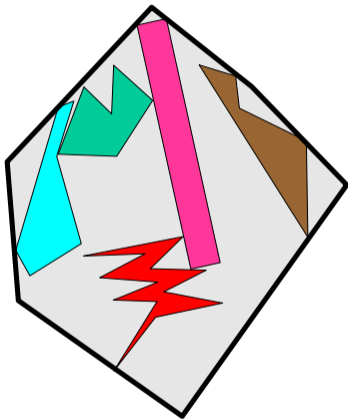
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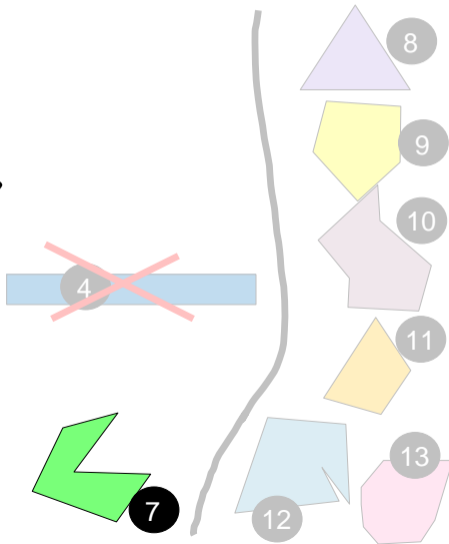
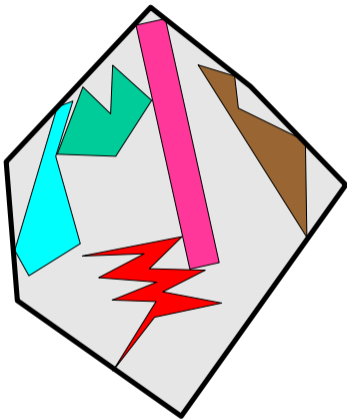
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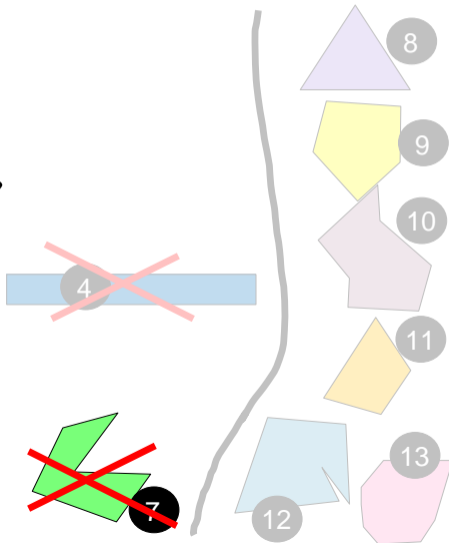
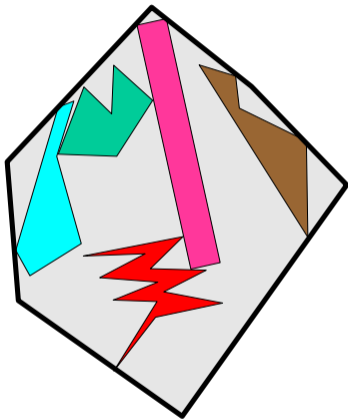
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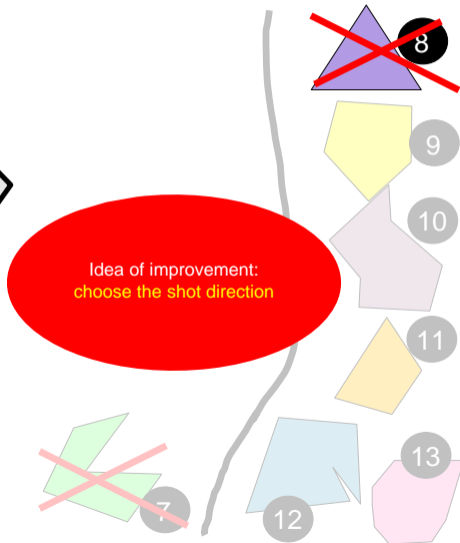
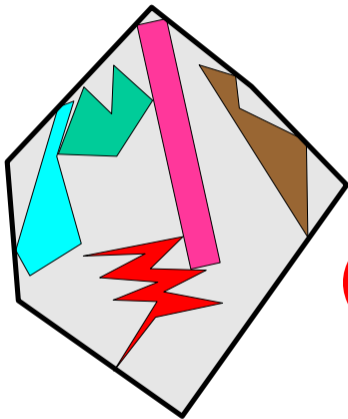
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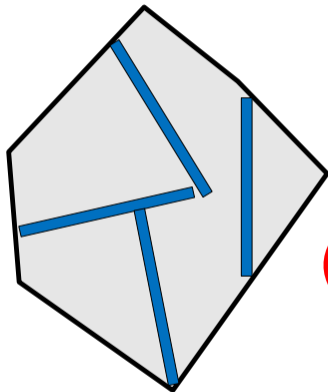
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Idea of improvement:
choose the shot direction

For long items:
Random is BAD

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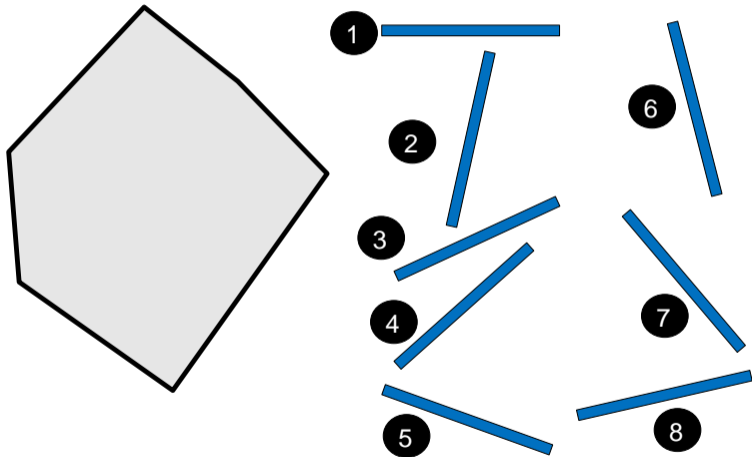
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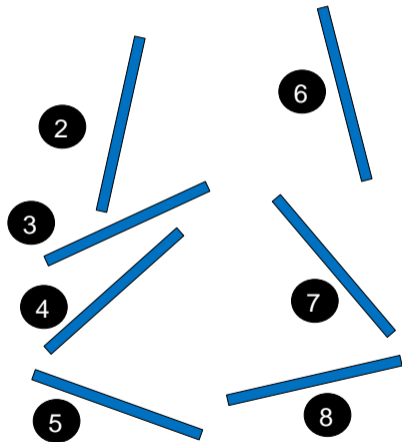
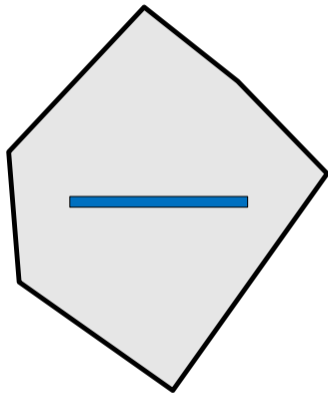
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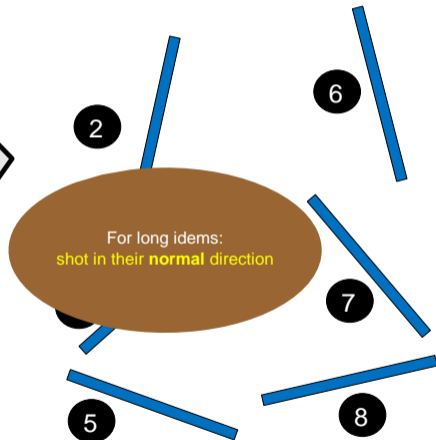
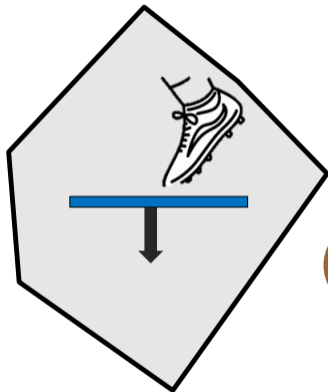
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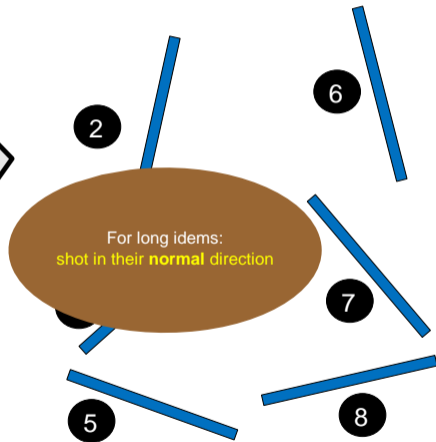
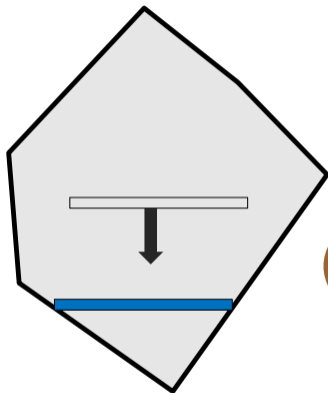
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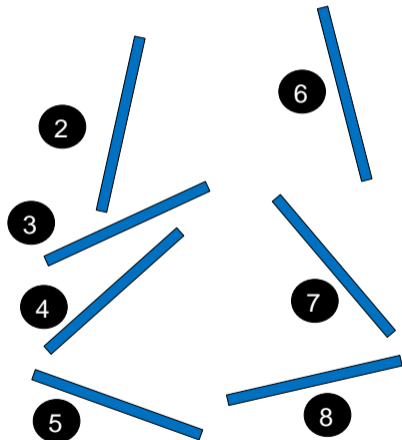
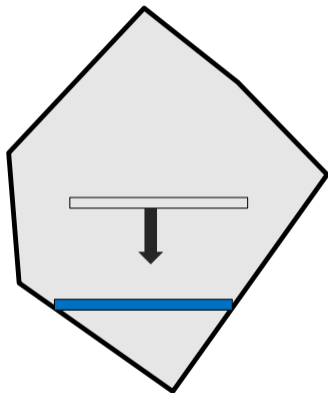
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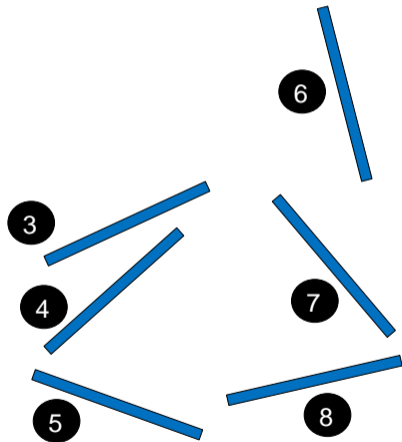
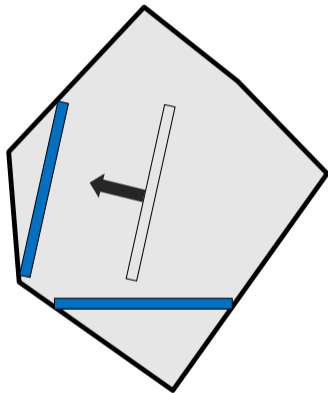
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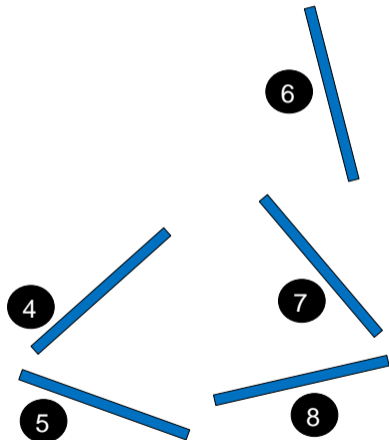
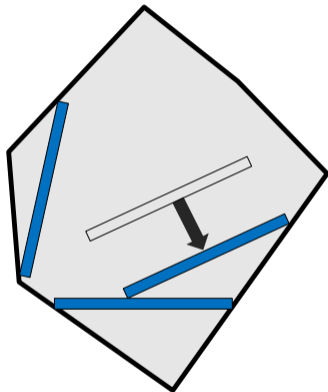
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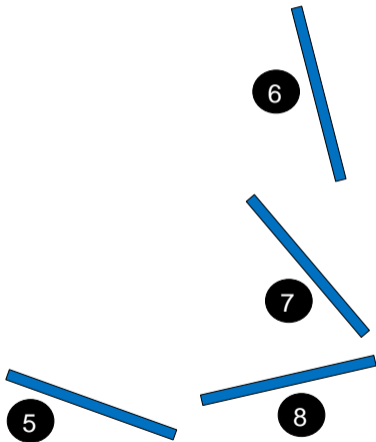
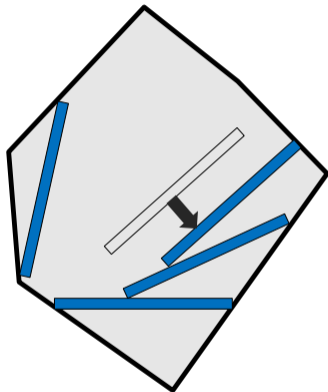
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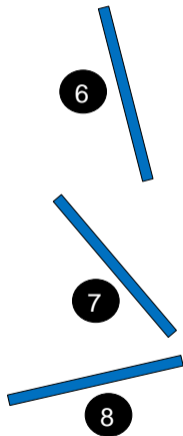
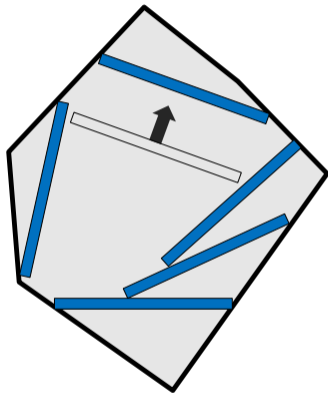
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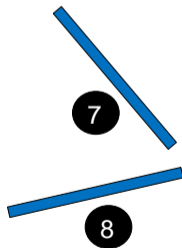
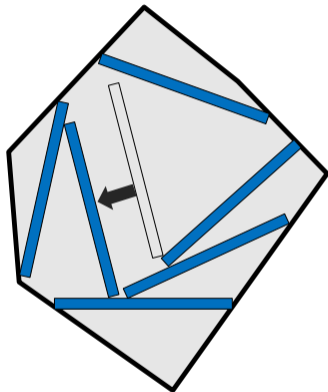
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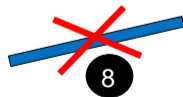
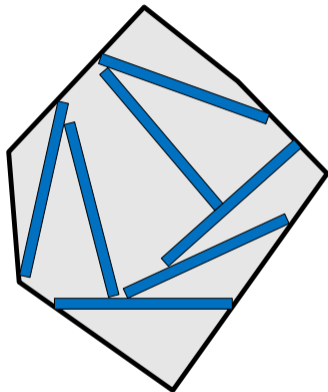
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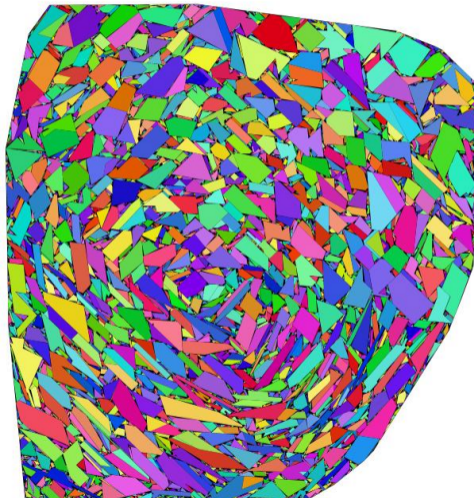
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Another thing to improve

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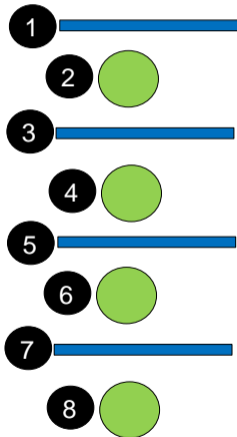
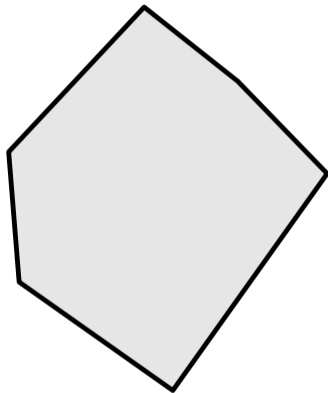
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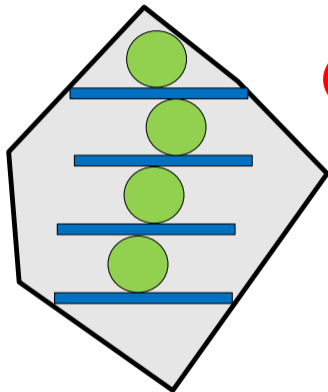
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Not efficient



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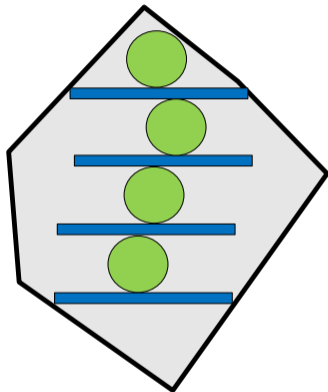
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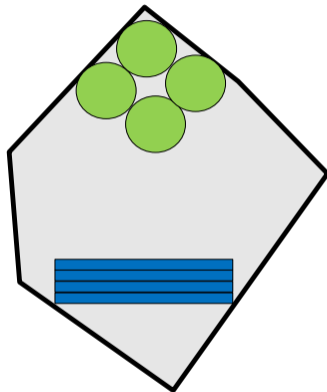
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Not efficient



Much better

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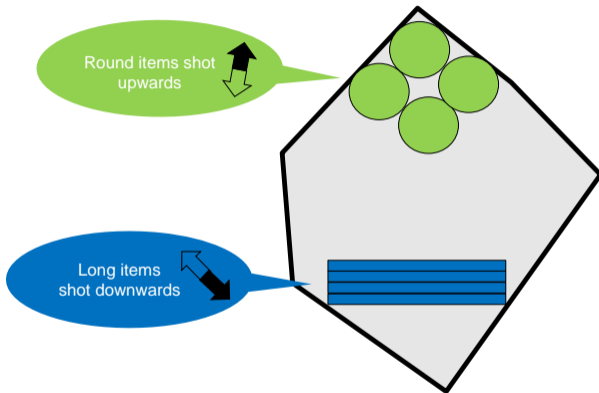
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Different Packing Strategies

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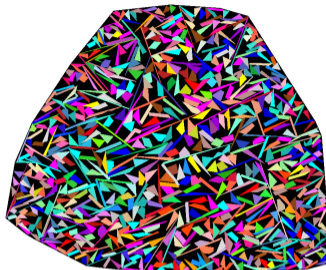
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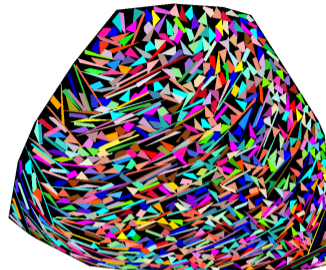
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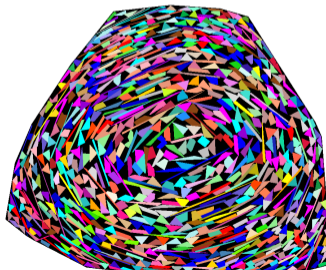
Some results



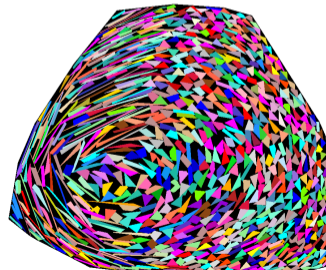
Score= 0,82



Score= 0,85



Score= 0,89



Score= 0,92

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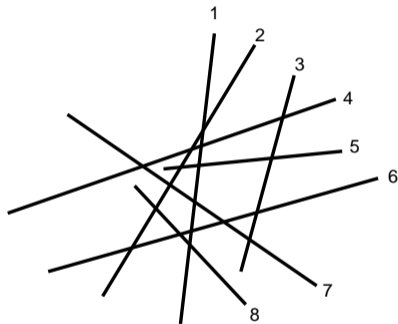
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Input: n segments in the plane

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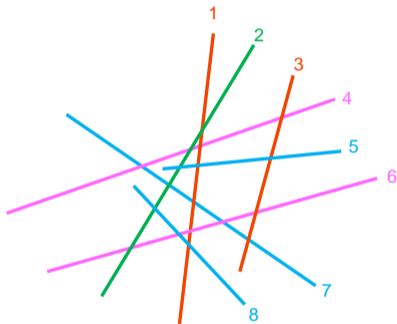
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Input: n segments in the plane

Output: segments coloring with a minimum number of colors so that two crossing segments don't have the same color...

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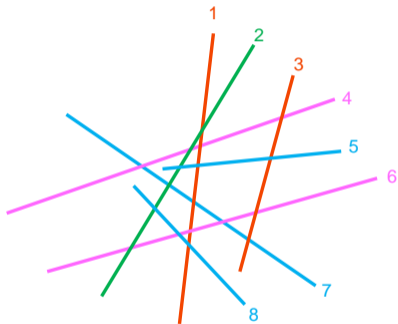
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Input: n segments in the plane

Output: segments coloring with a minimum number of colors so that two crossing segments don't have the same color...

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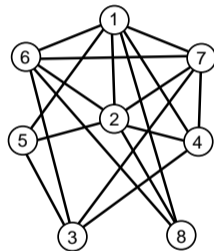
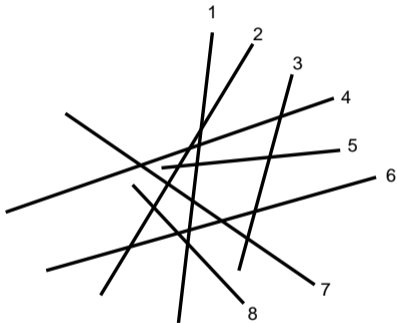
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Conflict graph

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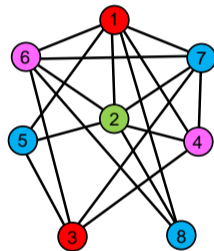
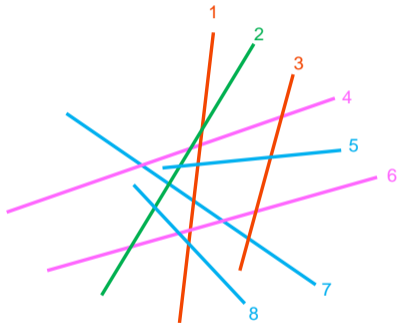
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Any graph coloring algorithm can be used...
or algorithms using geometry

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Many graph coloring heuristics...

DSATUR [Brélaz, 1979]

RLF [Leighton, 1979]

Tabu search [Hertz and de Werra, 1987]

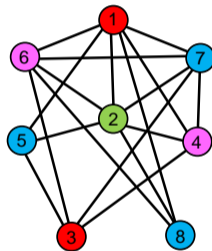
Hybrid evolutionary algorithms

Population-based hybrid algorithms

Reduce and solve algorithms

Modified cuckoo algorithm

Boolean satisfiability formulation



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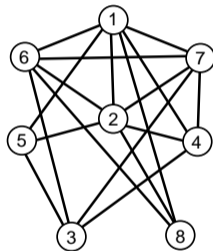
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Most simple heuristic

Initialization: order the vertices

Repeat: take the first uncolored vertex of the list
color it with the first possible color
(create a new color if necessary)



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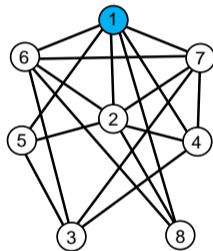
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Color 1

Most simple heuristic

Initialization: order the vertices

Repeat: take the first uncolored vertex of the list
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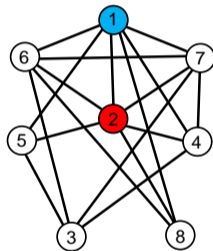
Color 1

Color 2

Most simple heuristic

Initialization: order the vertices

Repeat: take the first uncolored vertex of the list
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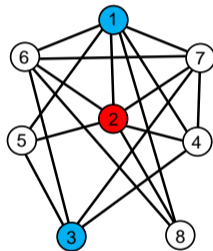
Color 1

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Initialization: order the vertices

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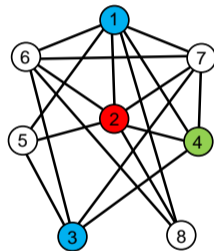
Color 2

Color 3

Most simple heuristic

Initialization: order the vertices

Repeat: take the first uncolored vertex of the list
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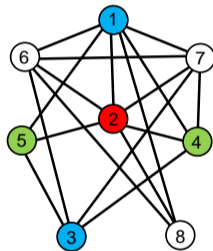
Color 2

Color 3

Most simple heuristic

Initialization: order the vertices

Repeat: take the first uncolored vertex of the list
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Color 1

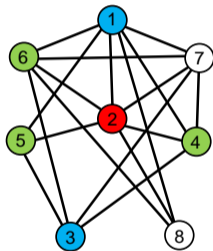
Color 2

Color 3

Most simple heuristic

Initialization: order the vertices

Repeat: take the first uncolored vertex of the list
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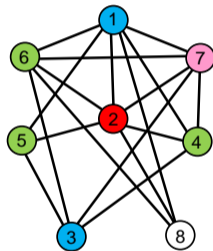
Color 3

Color 4

Most simple heuristic

Initialization: order the vertices

Repeat: take the first uncolored vertex of the list
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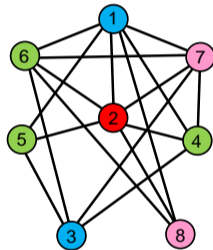
Color 3

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Most simple heuristic

Initialization: order the vertices

Repeat: take the first uncolored vertex of the list
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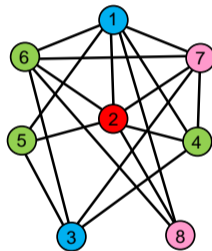
Color 4

Most simple heuristic

Initialization: order the vertices

Repeat: take the first uncolored vertex of the list
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Cool, but which order ?



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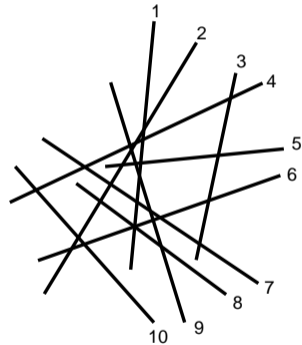
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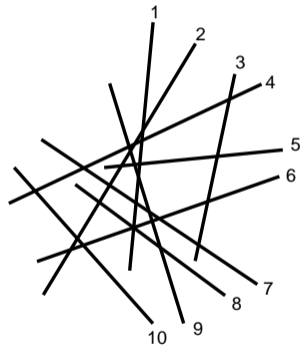
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Cool, but which order ?

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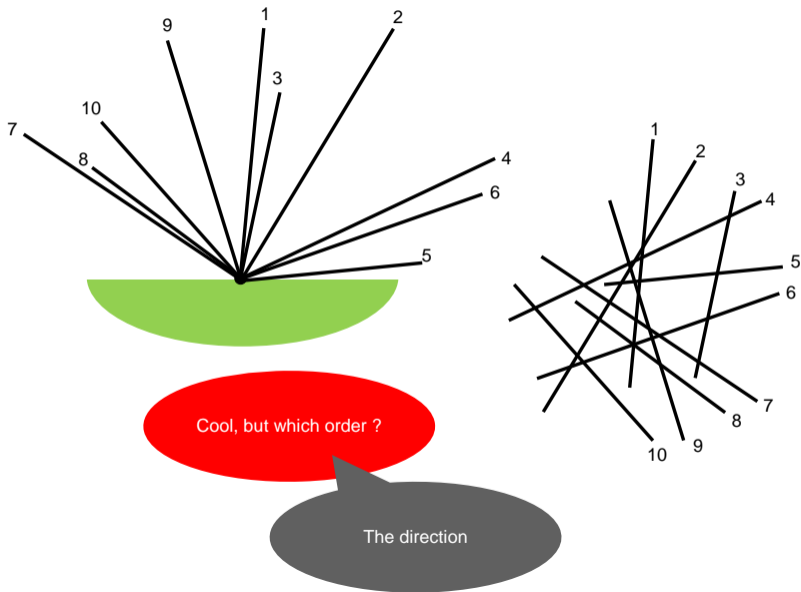
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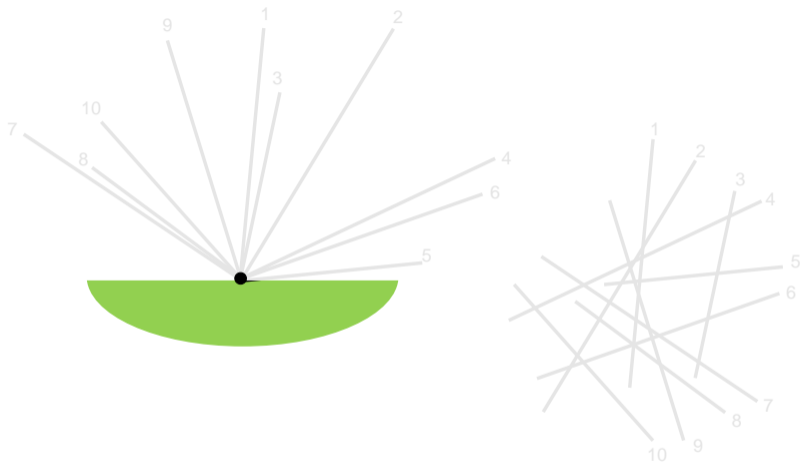
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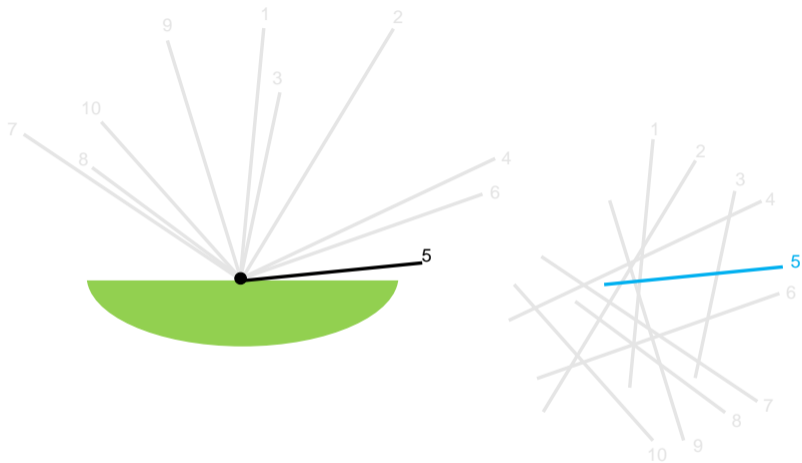
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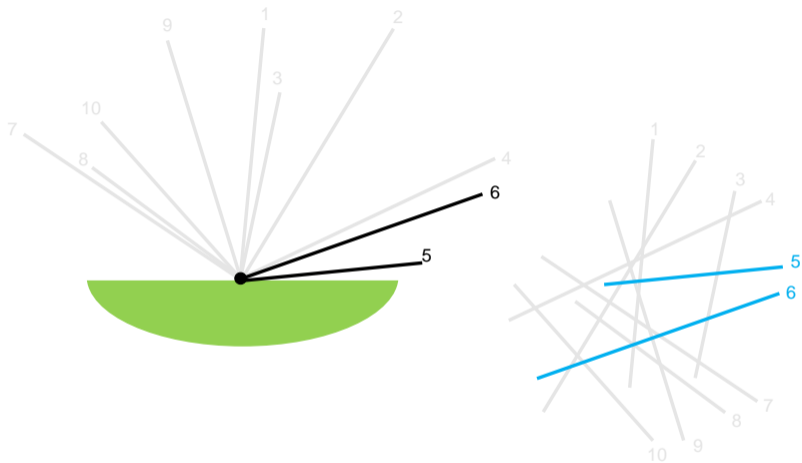
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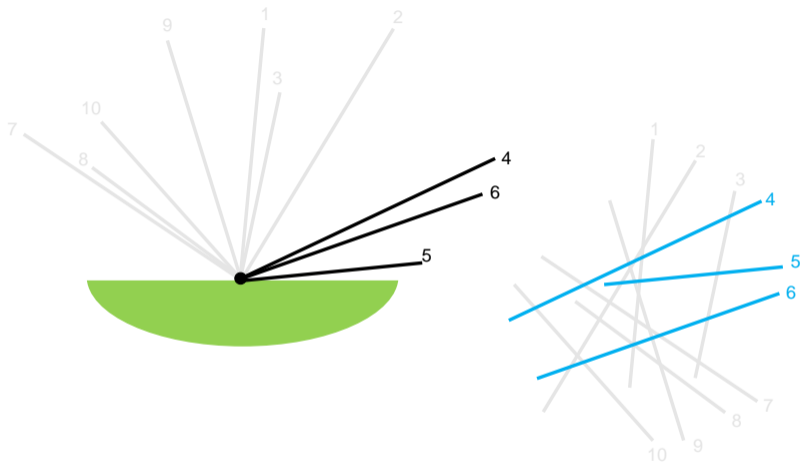
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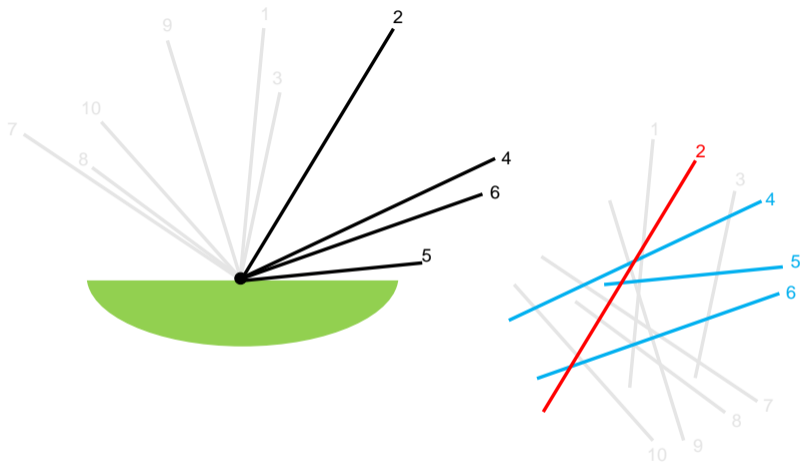
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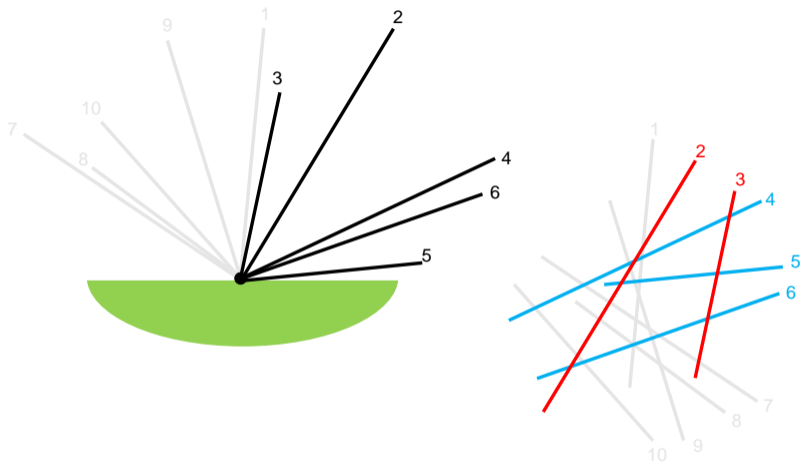
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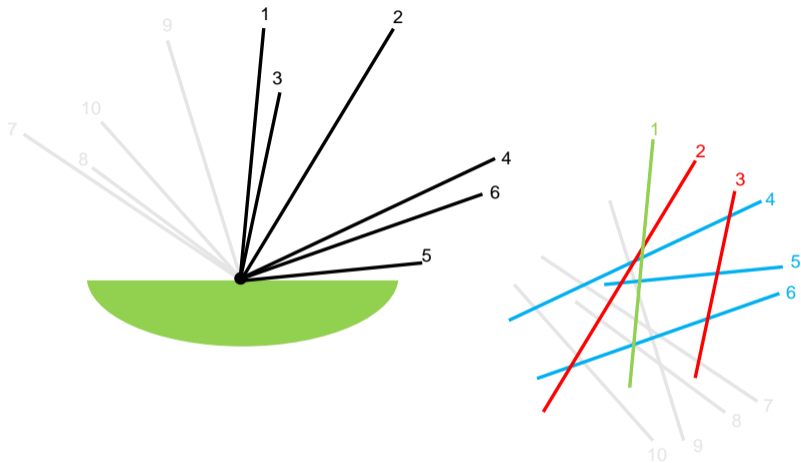
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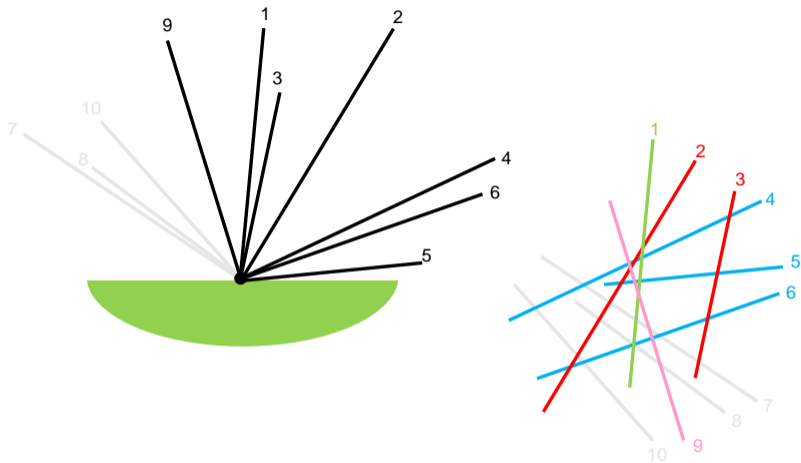
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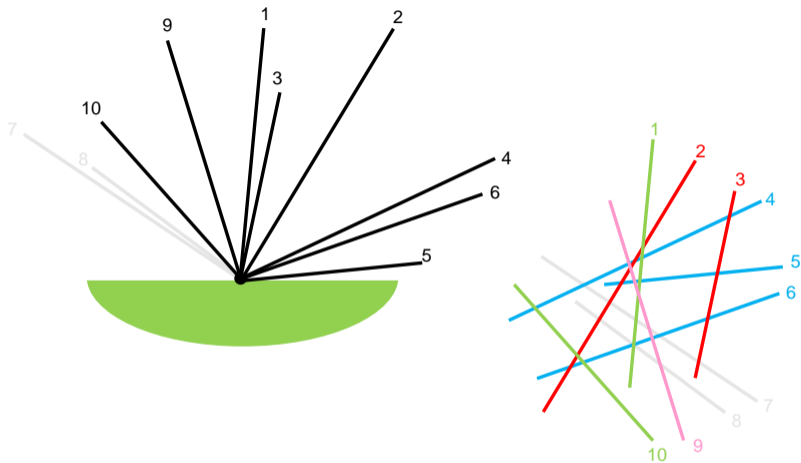
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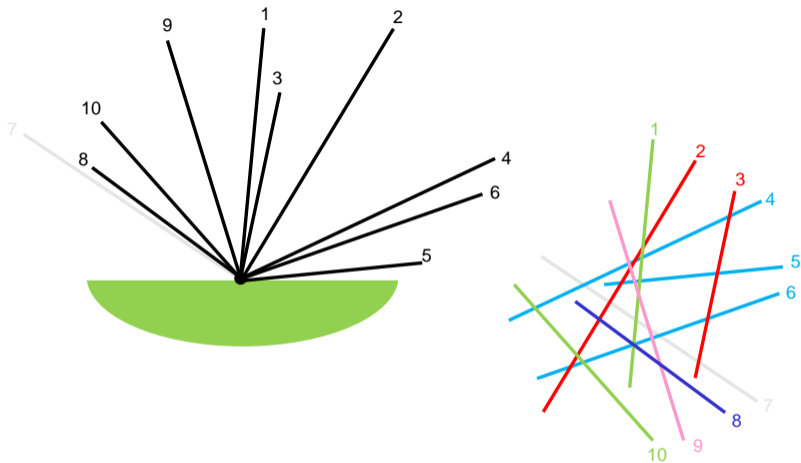
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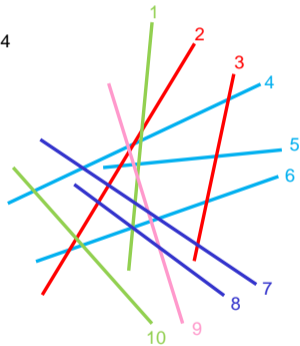
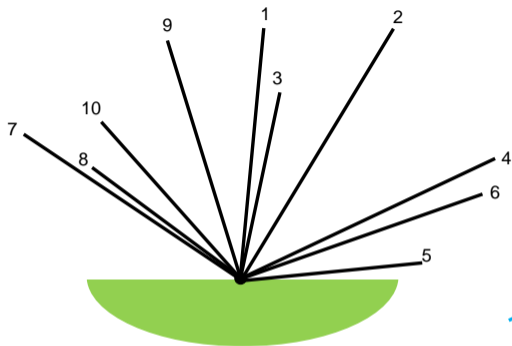
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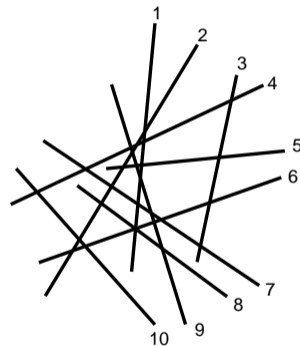
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Another greedy heuristic
(variant of DSatur)



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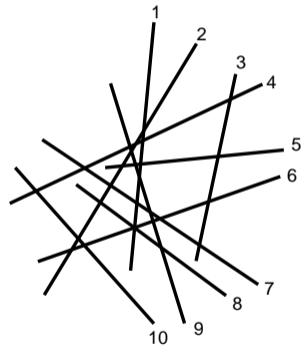
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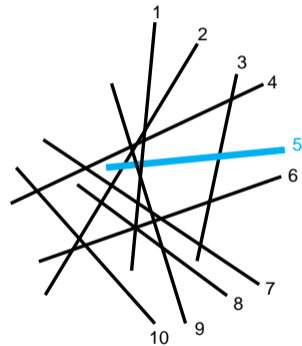
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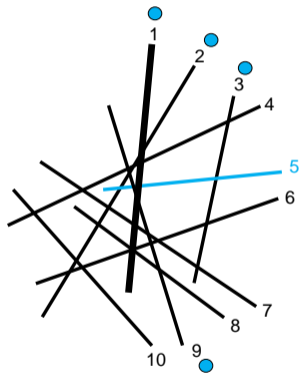
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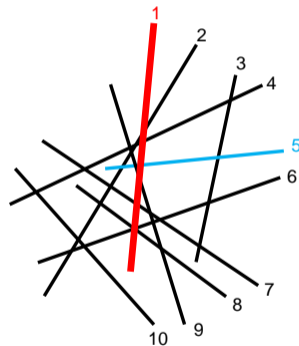
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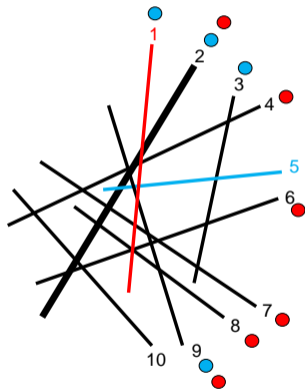
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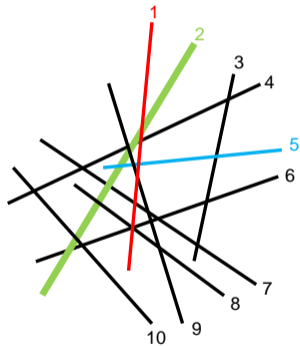
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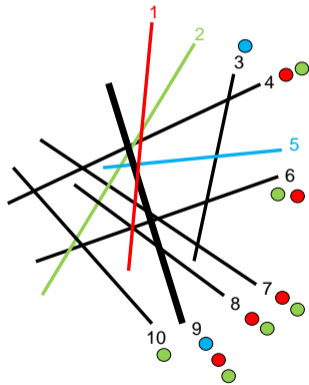
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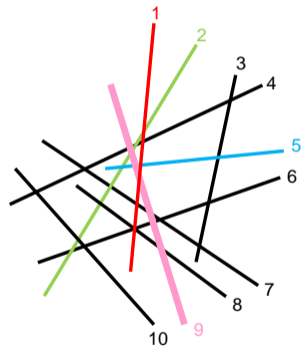
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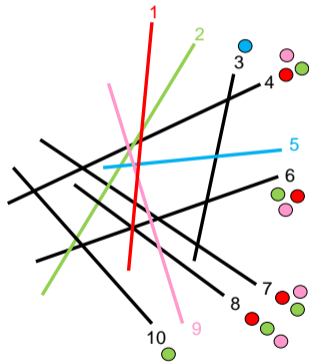
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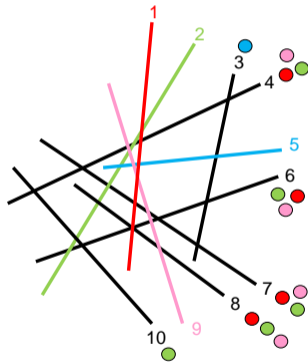
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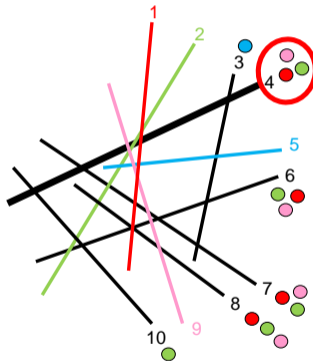
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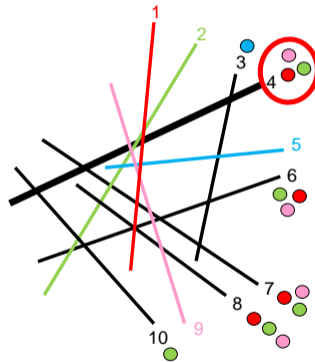
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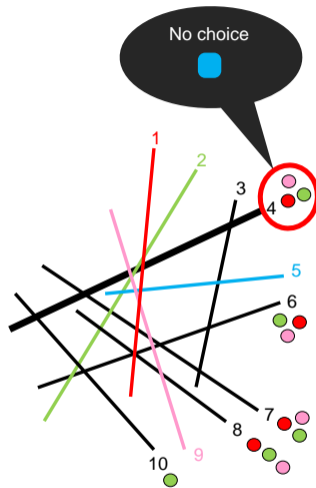
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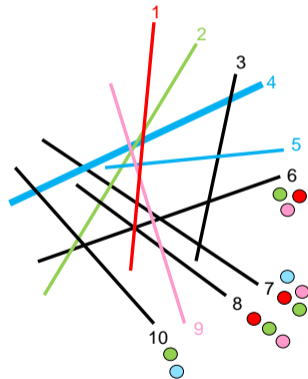
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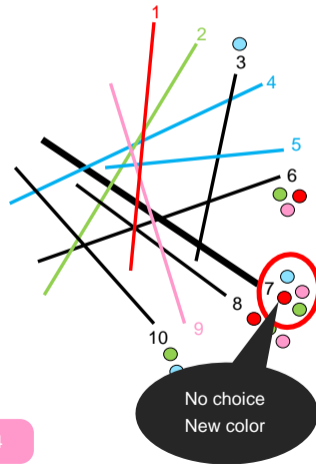
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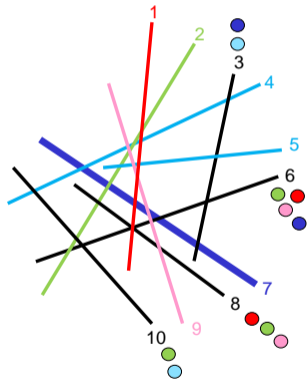
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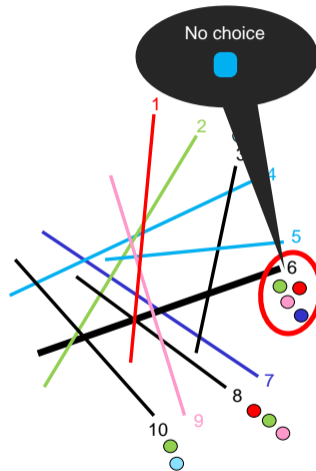
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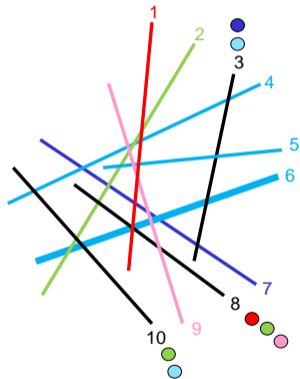
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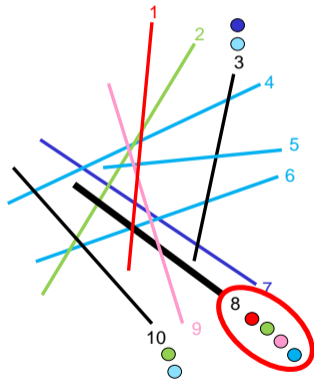
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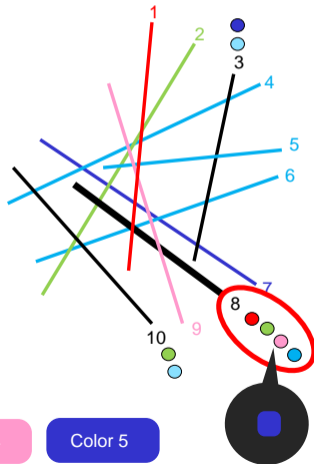
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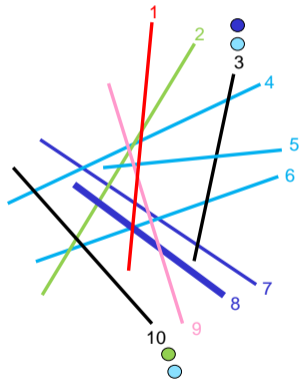
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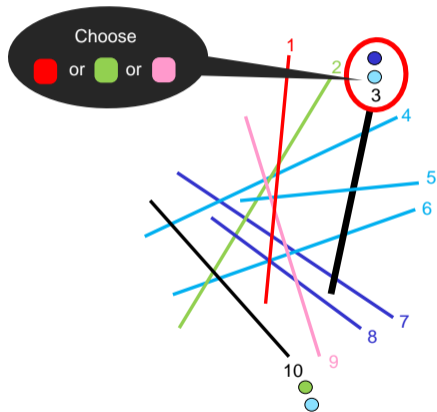
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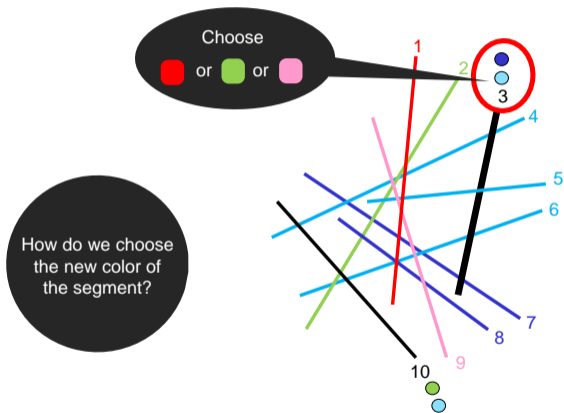
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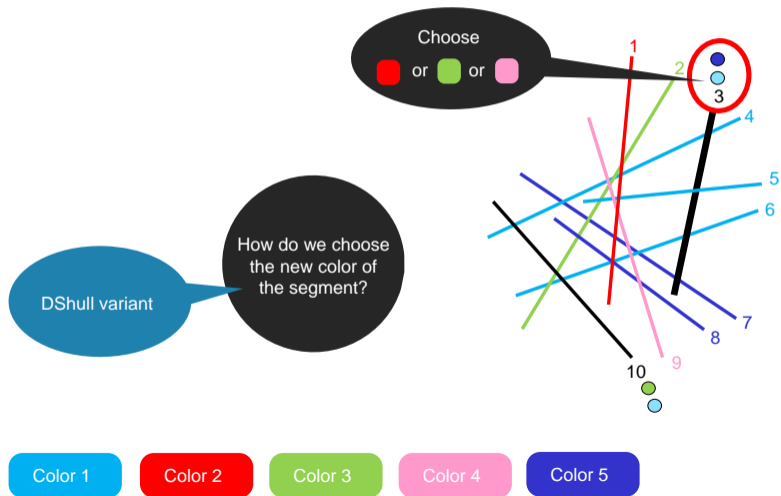
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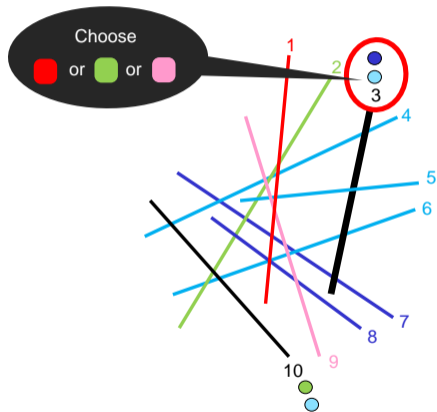
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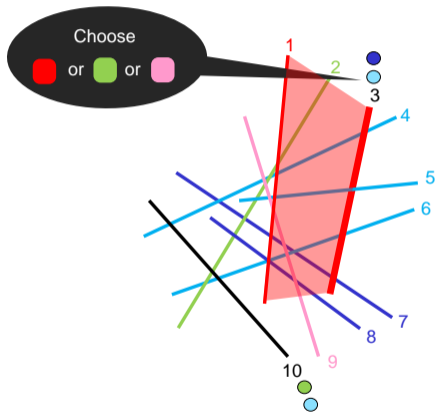
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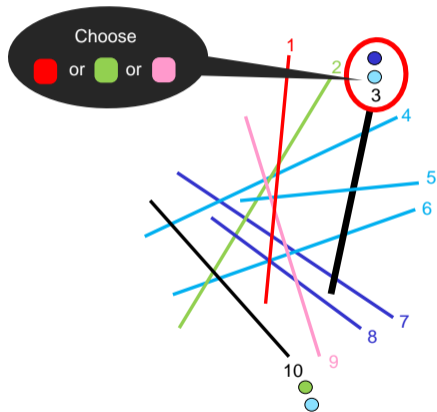
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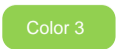
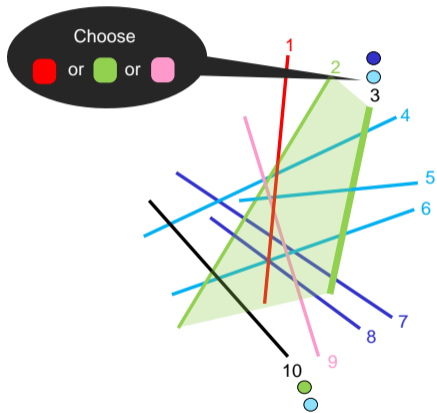
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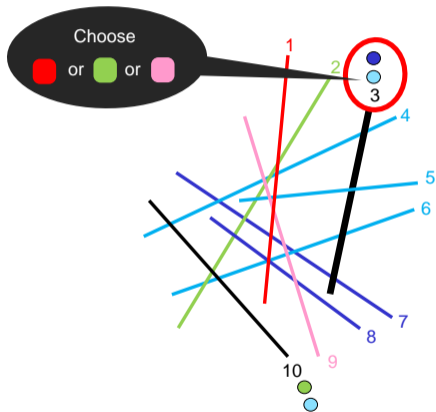
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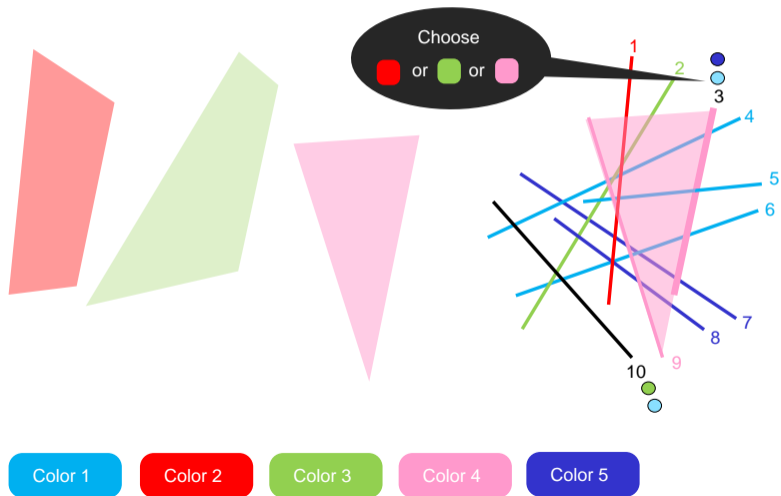
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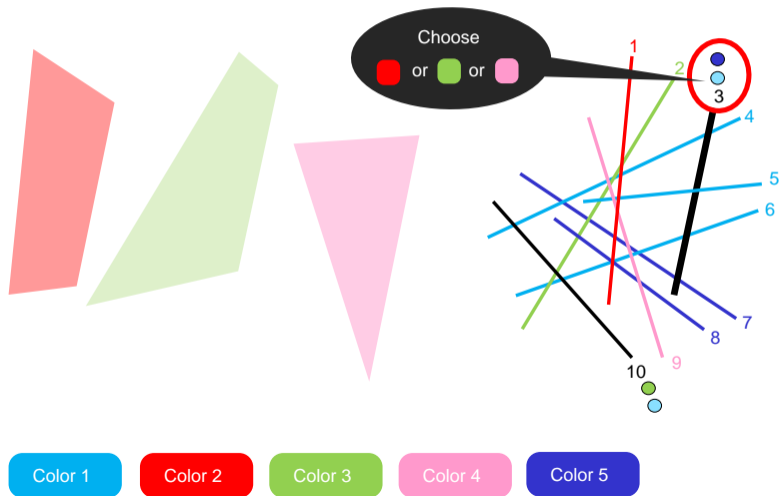
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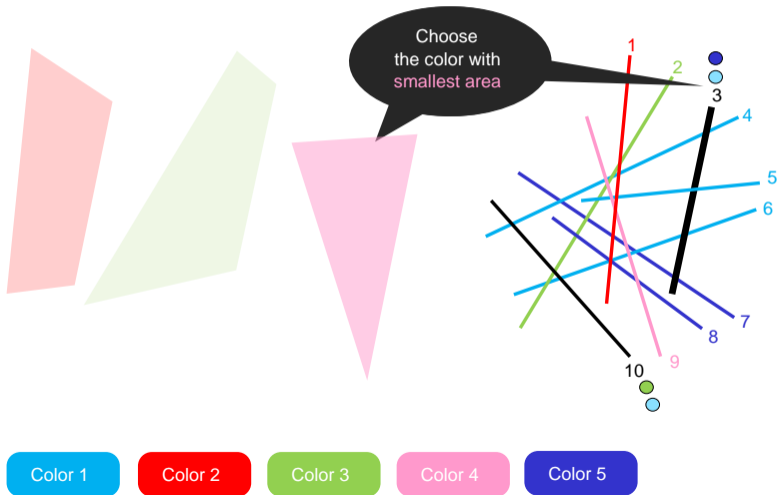
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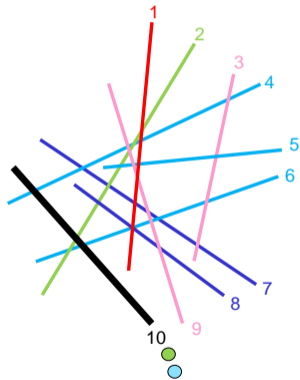
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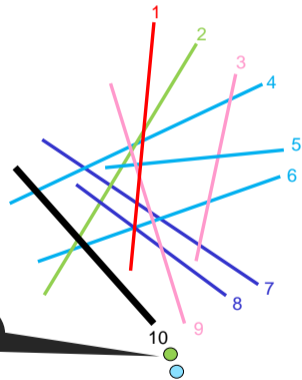
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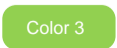
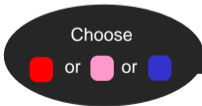
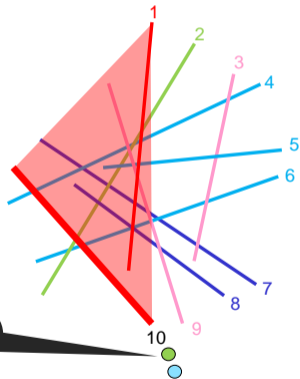
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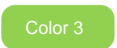
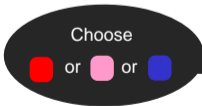
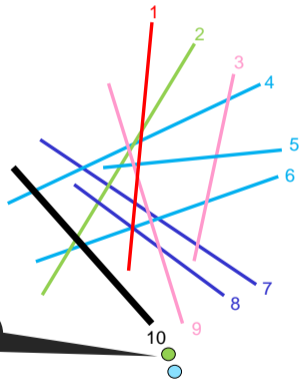
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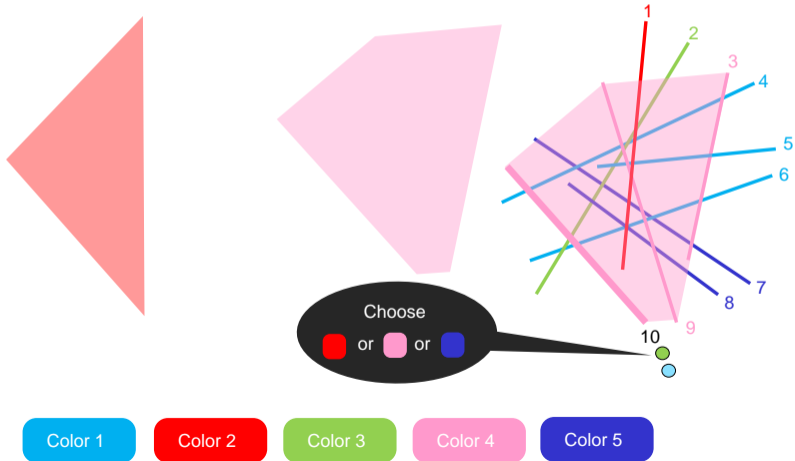
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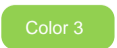
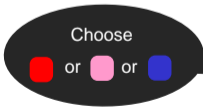
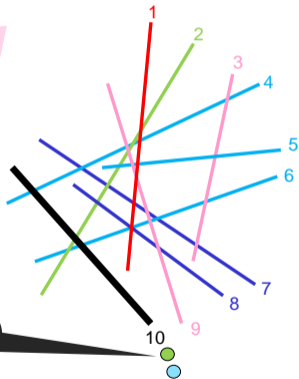
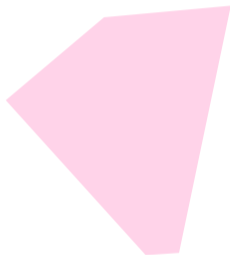
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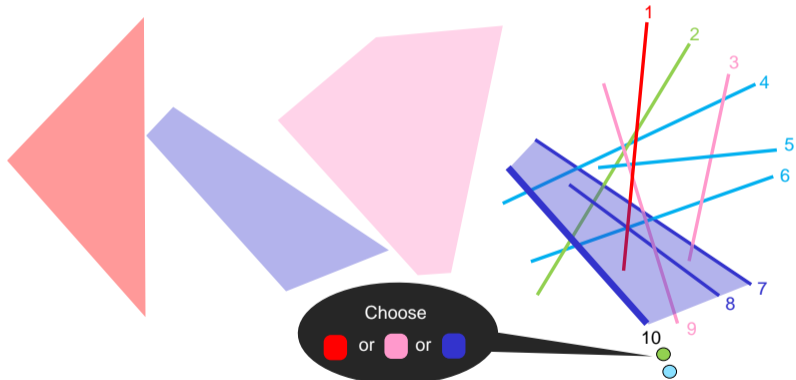
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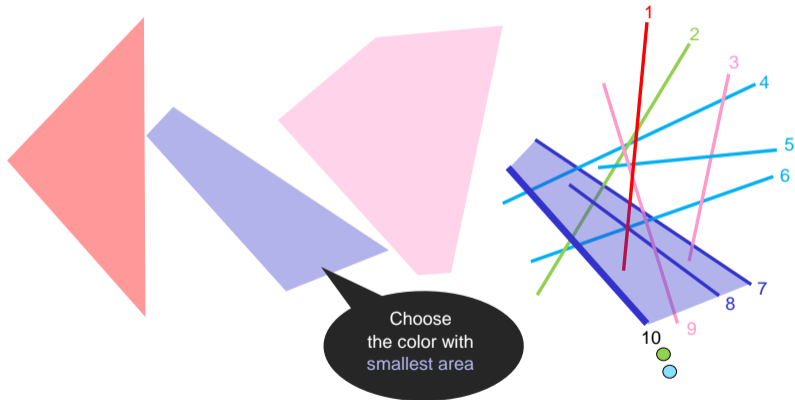
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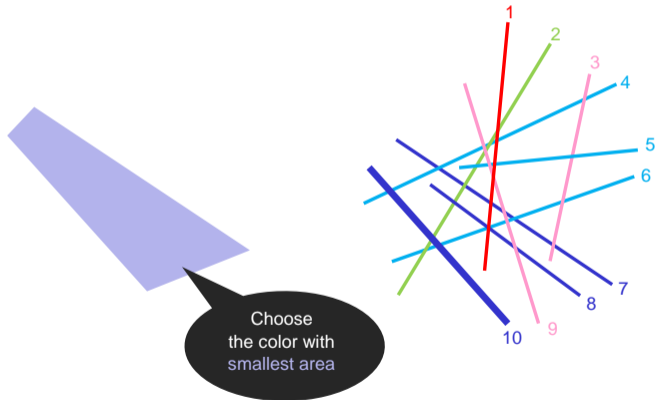
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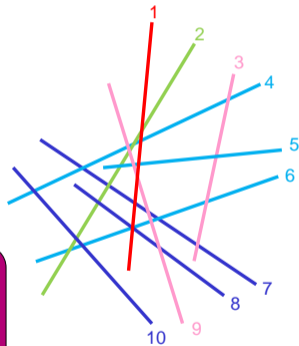
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Greedy algorithms

Fast and simple (easy and fast to code)

Can be randomized to provide many solutions



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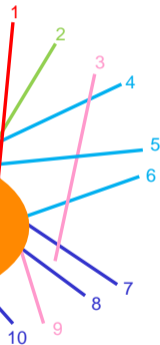
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Greedy algorithms
Fast and simple (easy and fast to code)
Can be randomized to provide many solutions

... solutions to
optimize with other
technics



Integer Programming (IP)

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Integer programming (IP):

- Variables: Take integer values
- Constraints: A set of linear inequalities
- Objective: A linear function to maximize or minimize

Solvers:

- Commercial solvers are quite efficient (CPLEX, Gurobi...)
- Some open source alternatives (GLPK, COIN-OR...)
- Optimal solutions or small gap are guaranteed
- Cannot solve huge problems

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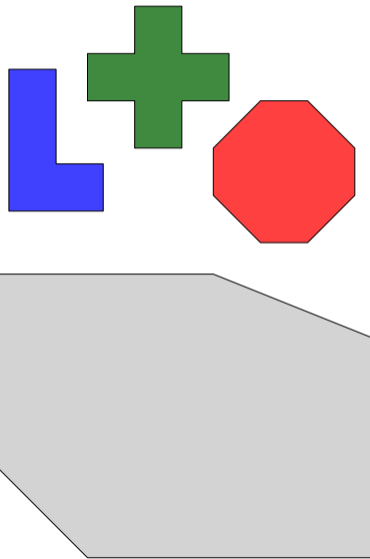
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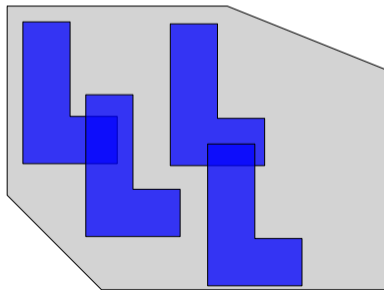
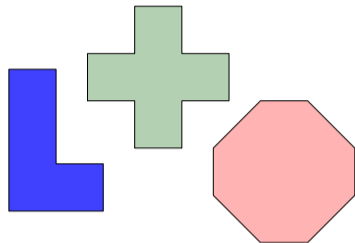
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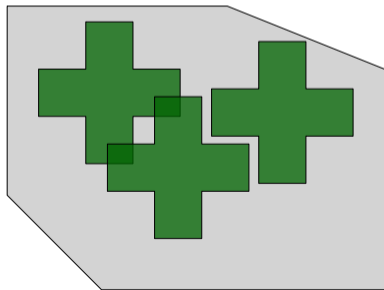
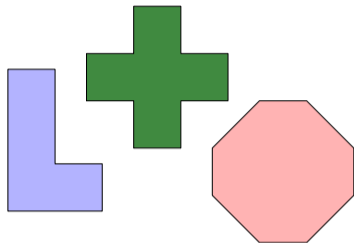
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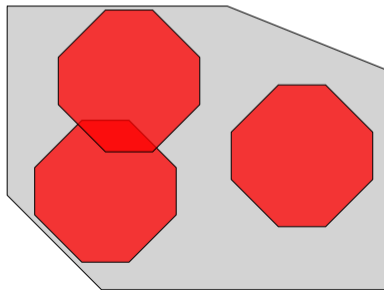
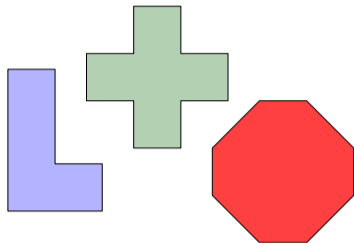
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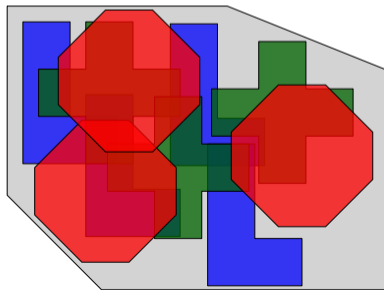
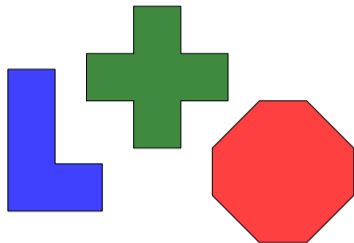
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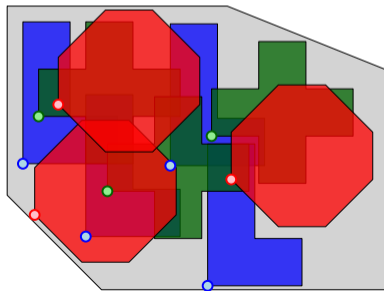
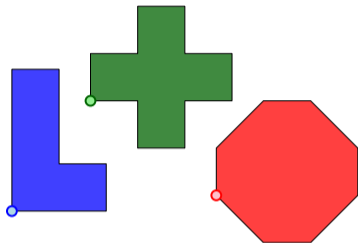
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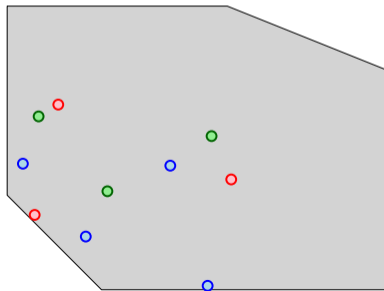
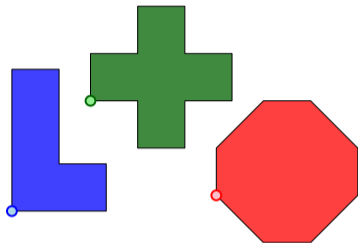
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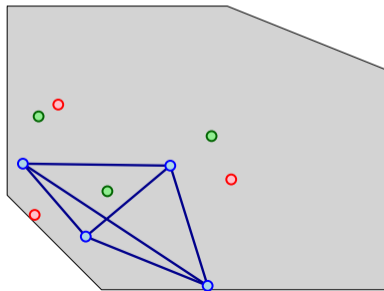
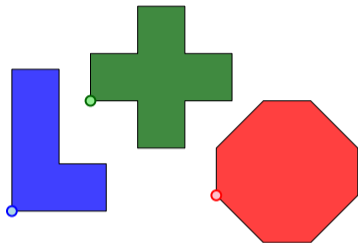
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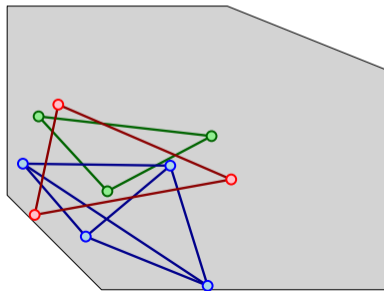
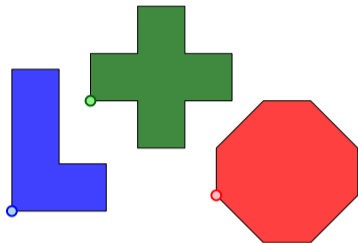
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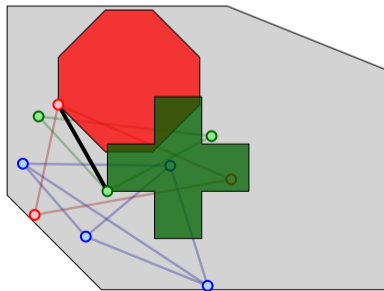
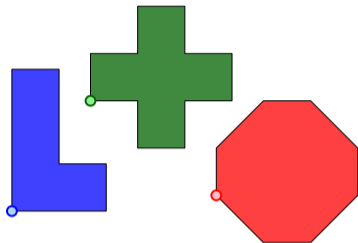
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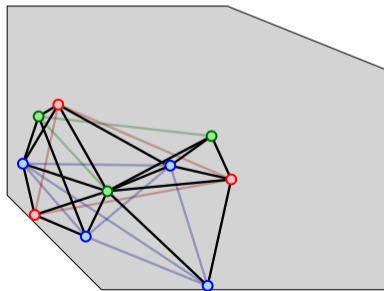
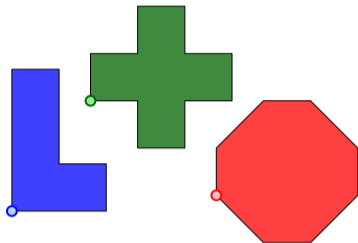
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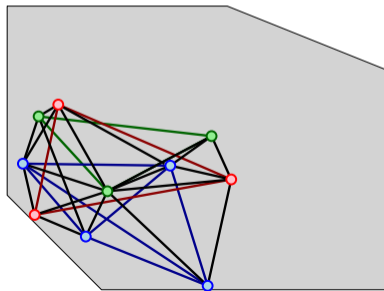
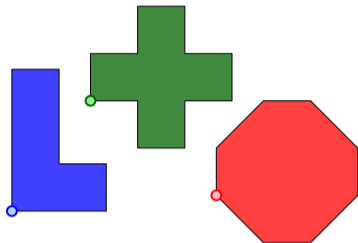
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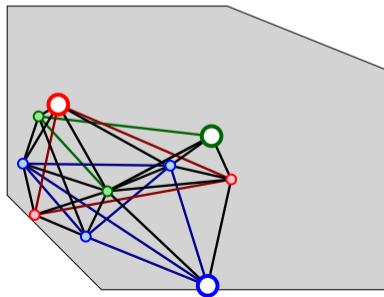
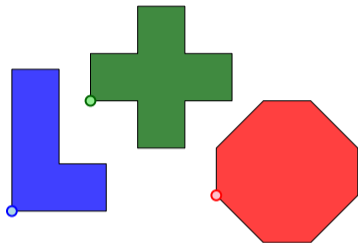
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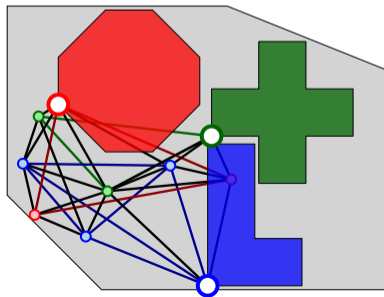
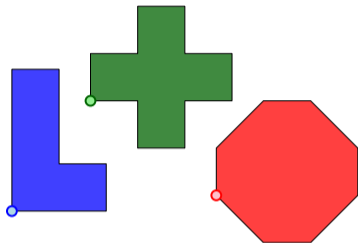
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Maximum Independent Set as Linear Programming

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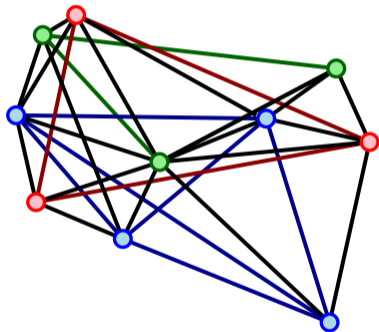
Some results

- Variables: vertices
0: not in the solution
1: in the solution
- Objective: Maximize sum of variables
- Constraints: edge uv becomes $u + v \leq 1$
- Better constraint for clique C

$$\sum_{v \in C} v \leq 1$$

- And for k copies of the same item

$$\sum_{v \in C} v \leq k$$



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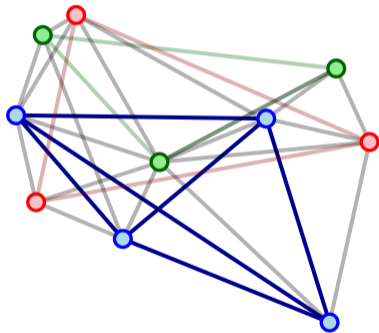
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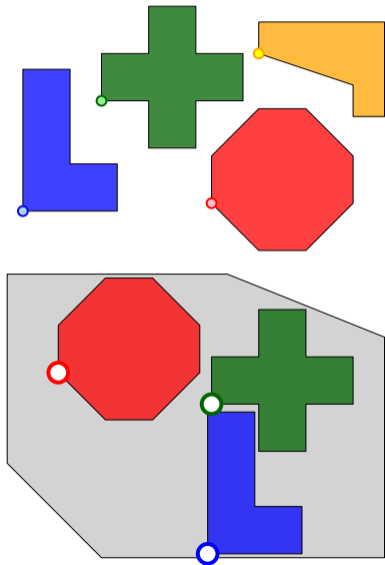
2-Conflict

Robots

Coloring

Some results

- CPLEX can only handle ~ 1000 vertices
- Not enough copies of each item
- Solution: We repeat with some translations near the previous solution
- Also random translations of every item
- If we are lucky, we pack more items



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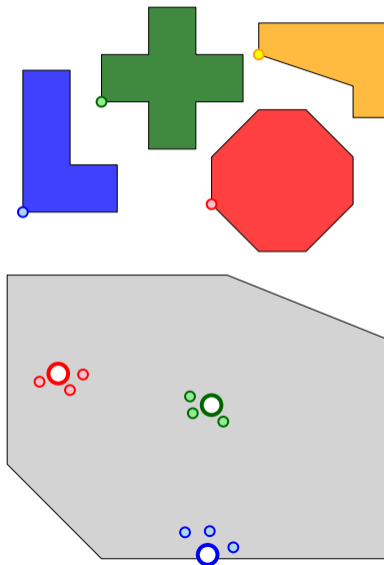
2-Conflict

Robots

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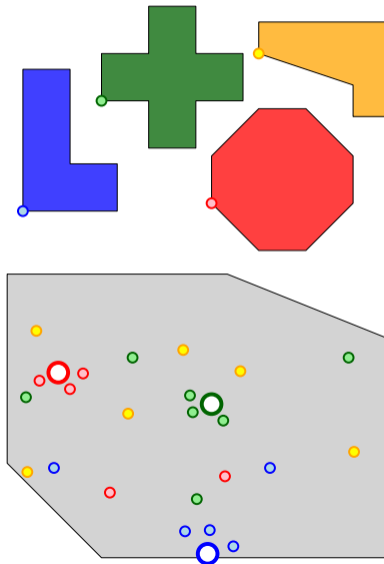
2-Conflict

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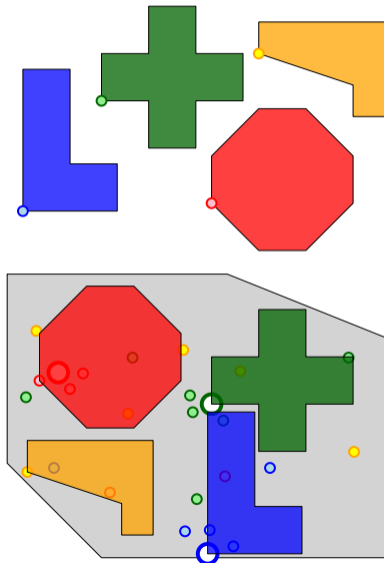
2-Conflict

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- Not enough copies of each item
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Convex Covering in Two Steps

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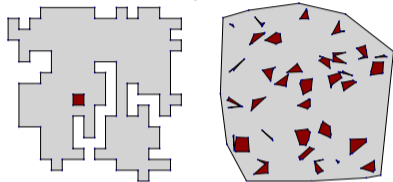
Robots

Coloring

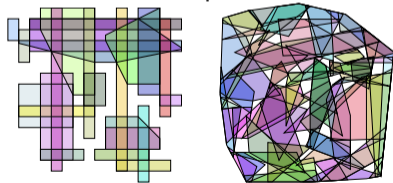
Some results

- We want to cover a polygon (with holes) using convex polygons
 - Goal: Reduce a geometric problem to a combinatorial problem
- 1 Create a collection of many large convex polygons
 - 2 Find a small subset of the collection
 - We show how to solve step 2

Input



Output



Convex Covering in Two Steps

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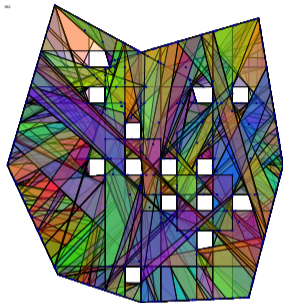
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382 convex polygons

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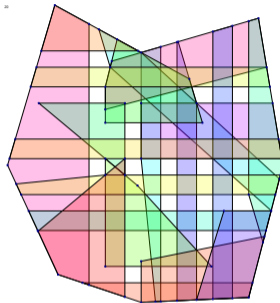
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20 convex polygons

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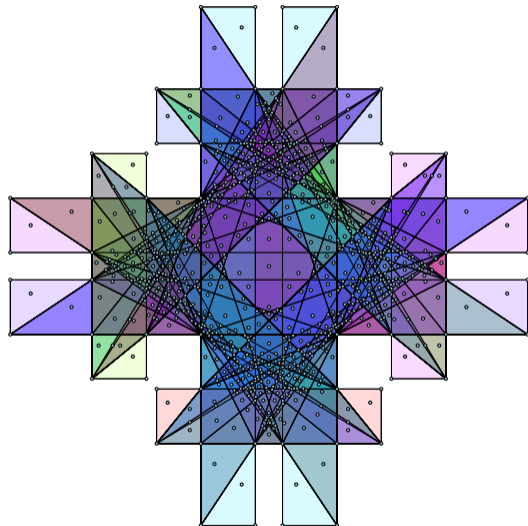
Coloring

Some results

\mathcal{C} : Convex polygons from phase 1

P : Instance polygon with holes

- (\mathcal{C}, P) define a set system
- P has infinitely many points
- First attempt: reduce P to a quadratic number of witnesses, one point per arrangement cell
- Too many witnesses!
- Building the arrangement is slow!



1009 witnesses for 82 convex polygons

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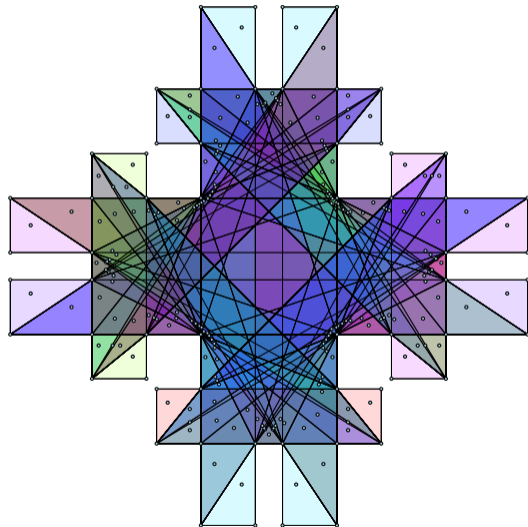
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Robots

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Some results

- Solution: only place witnesses near vertices of P
- Does not guarantee that P is covered
- Two possible fixes:
 - Add a witnesses inside each uncovered area and repeat (generally better, but slower)
 - Cover the uncovered area using some quick heuristic (faster and sometimes better)



200 witnesses for 82 convex polygons

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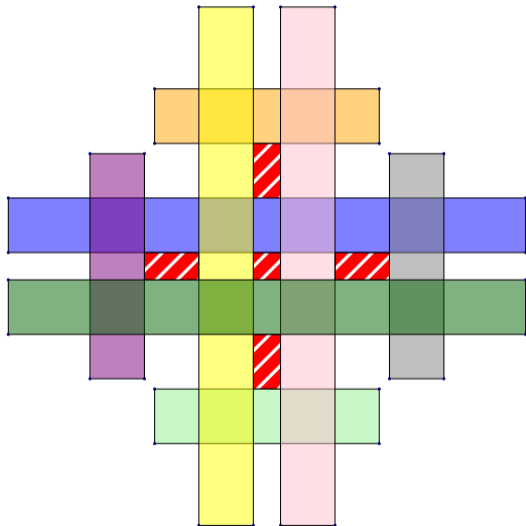
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5 uncovered regions 8 convex polygons

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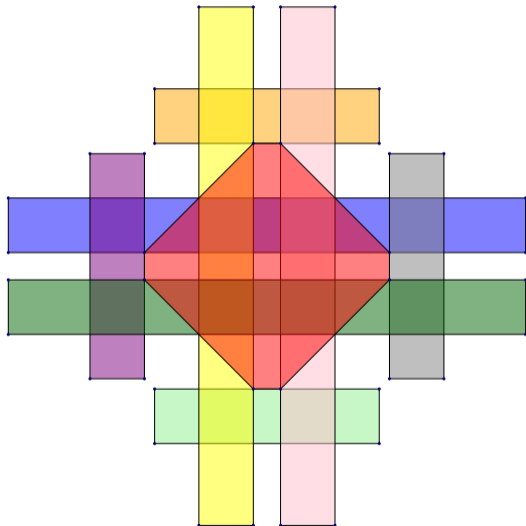
2-Conflict

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0 uncovered regions 9 convex polygons

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Some results

Use integer programming (IP):

- Each set becomes a binary variable
 - 0: Not in the solution
 - 1: In the solution
- Each witness becomes a constraint:
 - the sum of the sets that contain it must be at least 1
- Objective: minimize the sum of all variables
 - Very fast for small to medium instances
 - Solutions often guaranteed optimal
 - On some large instances: slow and very bad solutions

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Improving Convex Cover with IP

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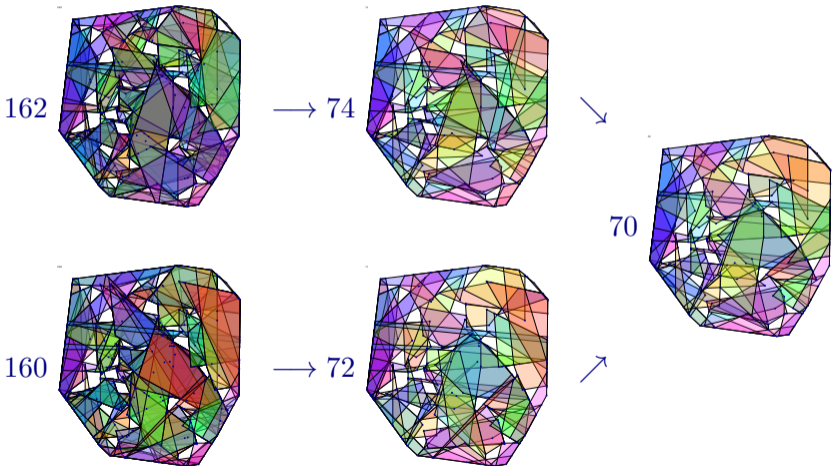
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Some results

We use multiple good solutions to get a better one



Improving Convex Partition with IP

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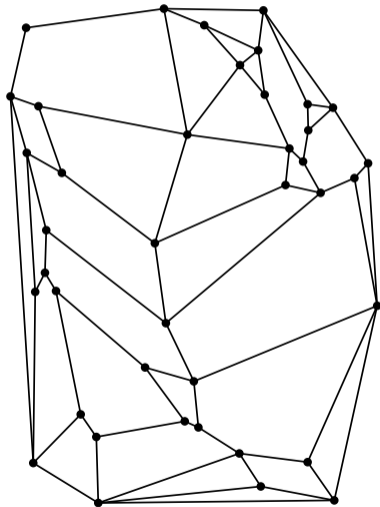
2-Conflict

Robots

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Some results

- Convex partition can easily be modelled as IP
- CPLEX can only solve small instances
- We improve a solution using CPLEX:
 - 1 Select some adjacent cells
 - 2 Remove selected cells
 - 3 Solve the polygon in the selected area
- The initial solution is not very relevant, we may start with a triangulation



Improving Convex Partition with IP

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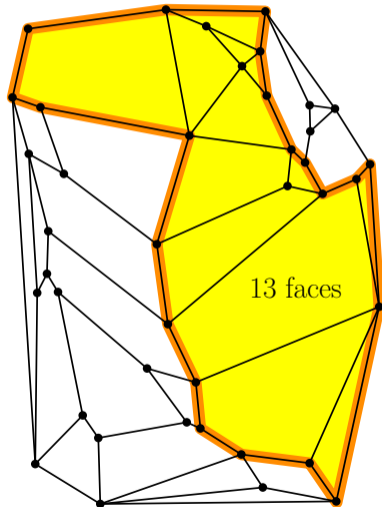
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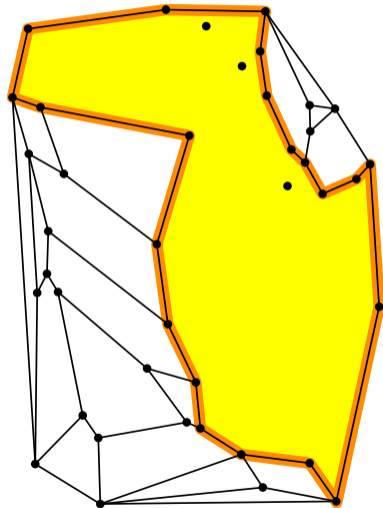
2-Conflict

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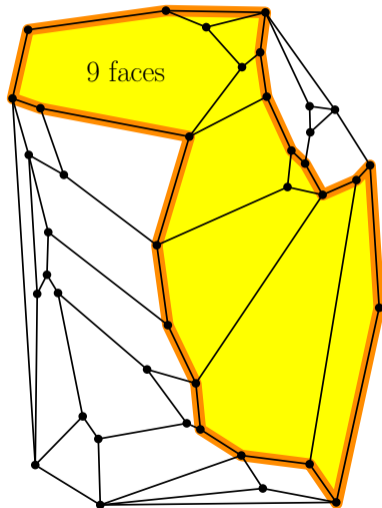
2-Conflict

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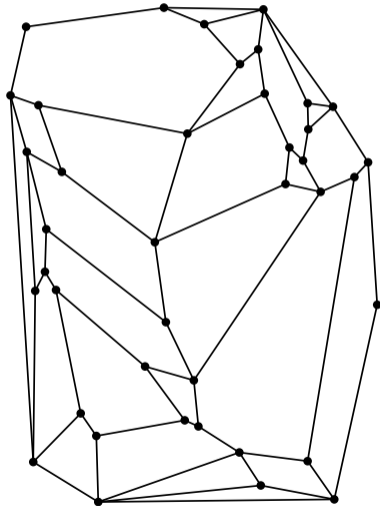
2-Conflict

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Improving Maximum Area Polygon with Local Search

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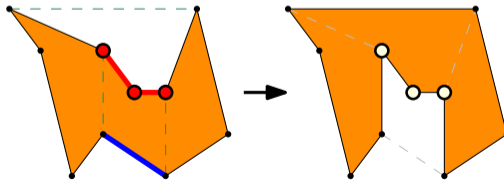
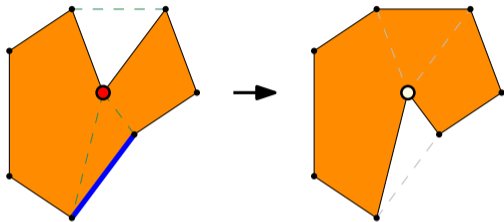
2-Conflict

Robots

Coloring

Some results

- We try to improve many solutions
- Sometimes a worse solution may improve better
- We move one or more vertices in the polygon order in order to increase the area
- For this problem, changes are small



Packing Local Improvement

Shadoks

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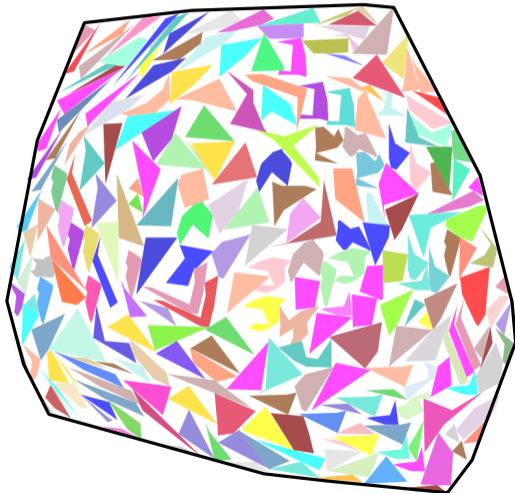
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Local Search for Packing

Packing Local Improvement

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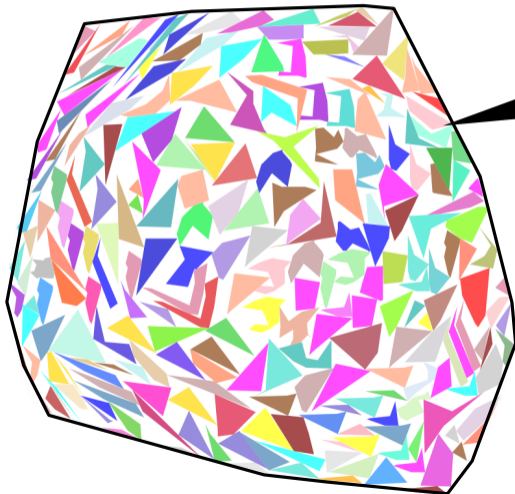
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Current solution

Packing Local Improvement

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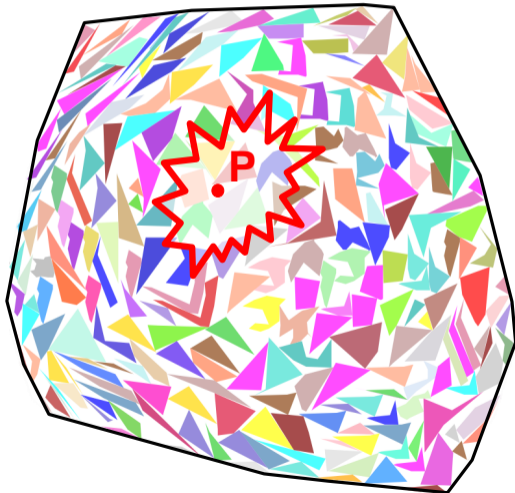
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1) Choose a **random point P** in the solution

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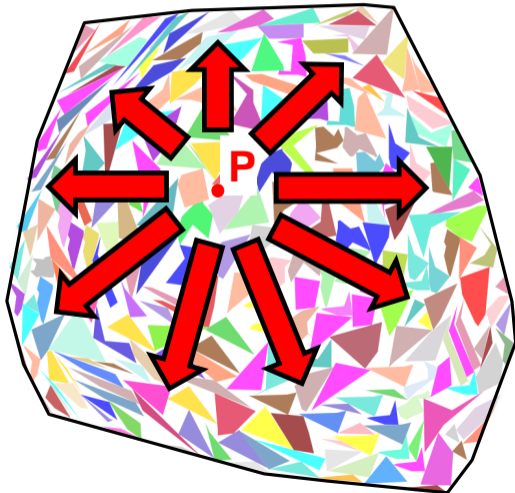
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1) Choose a **random point P** in the solution

2) **Push** every packed item away from **P**
(from the farthest to the closest)

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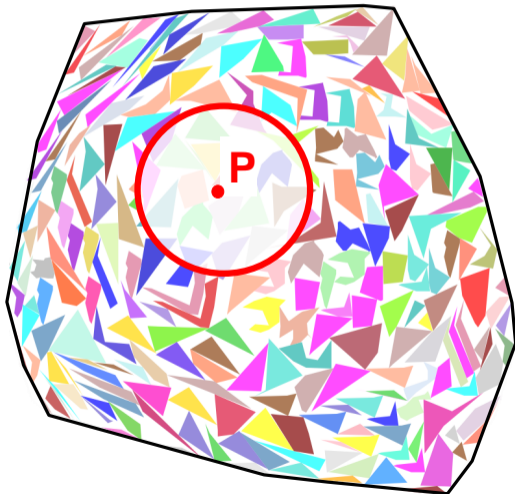
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Some results



1) Choose a **random point P** in the solution

2) **Push** every packed item away from **P**
(from the farthest to the closest)

3) **Try to pack** a new item around **P**
(if it crosses some packed items but
there could be a benefit, we pack the
new item)

More than Local Search ?

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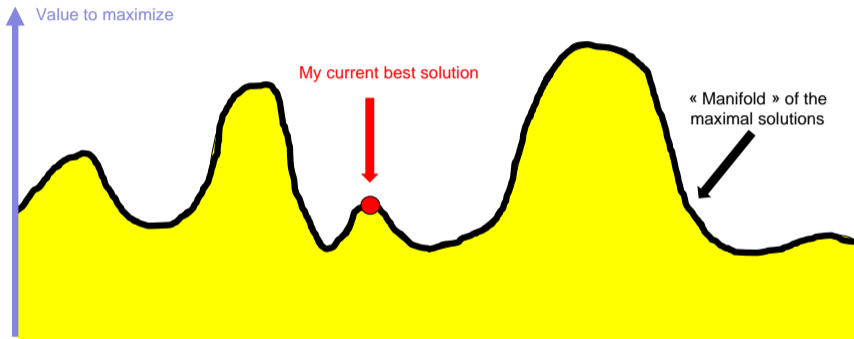
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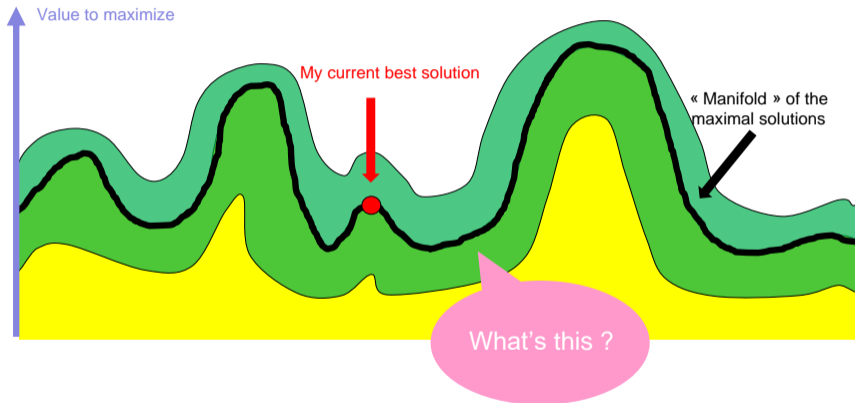
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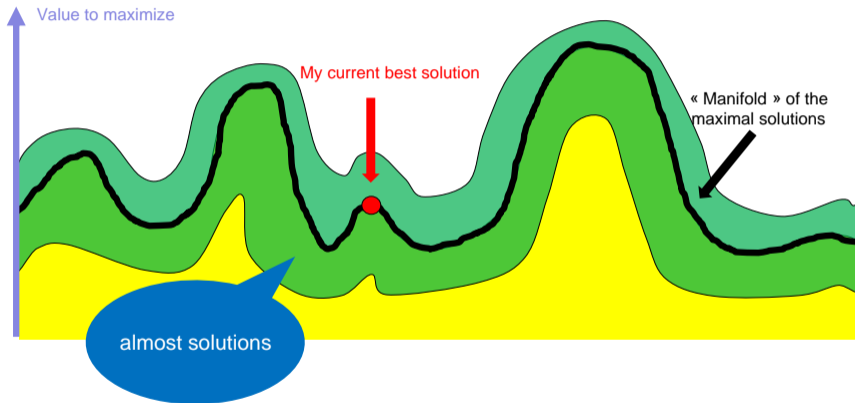
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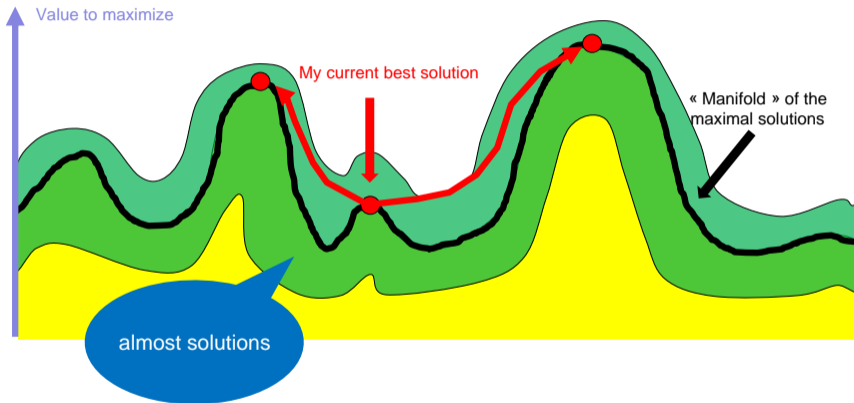
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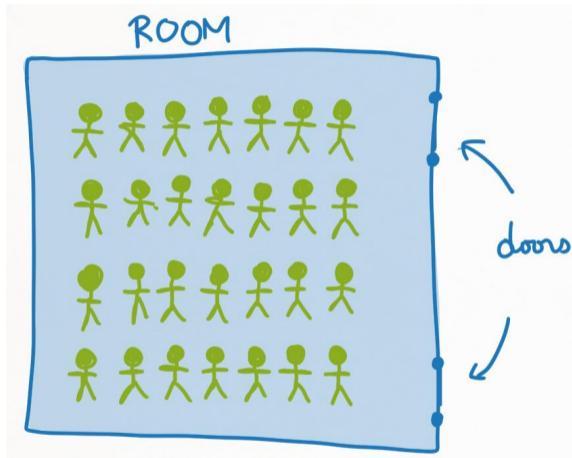
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28 agents in a room: find the best consensus of a complex combinatorial problem...

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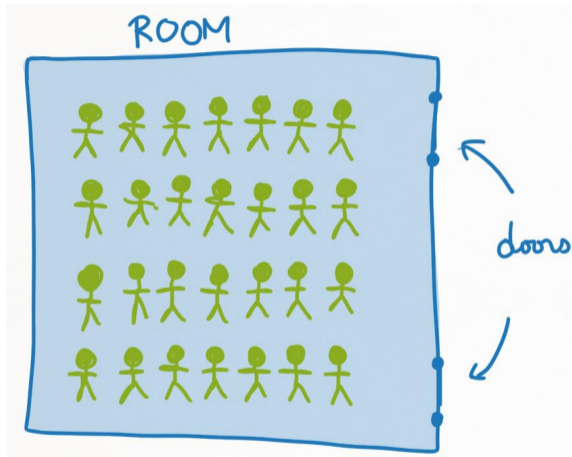
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28 agents in a room: find the best consensus of a complex combinatorial problem...

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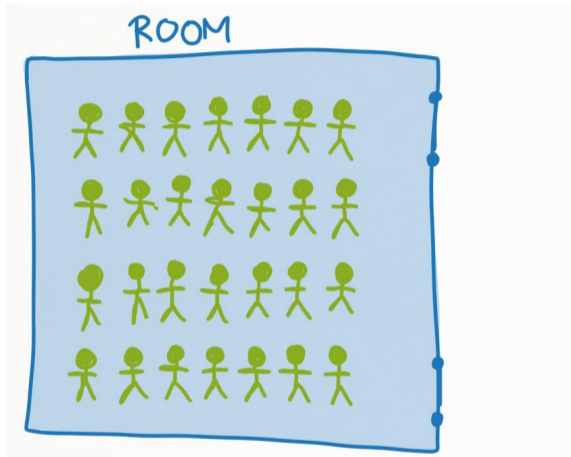
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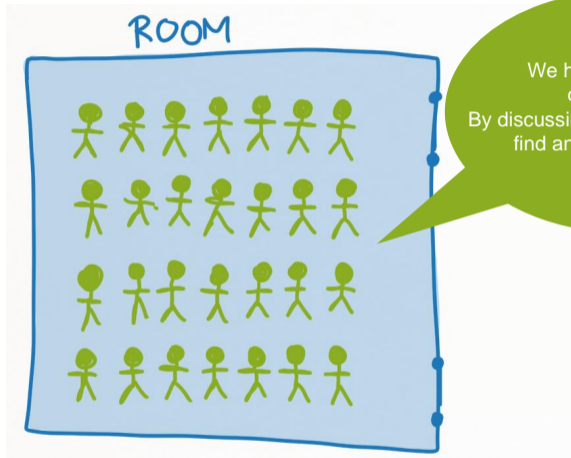
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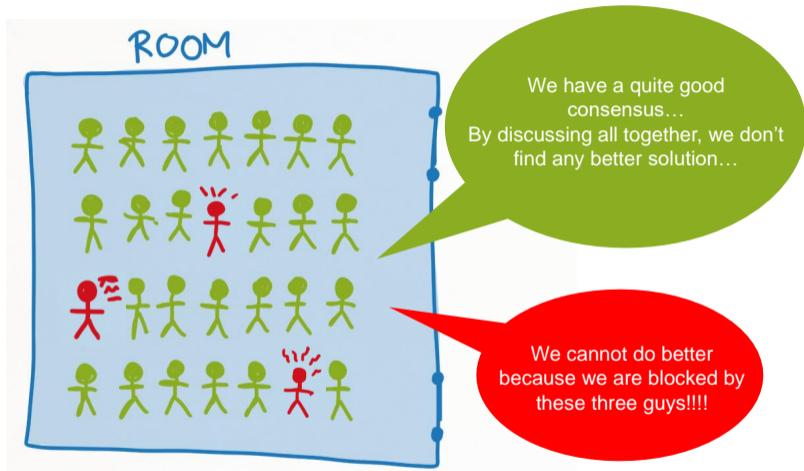
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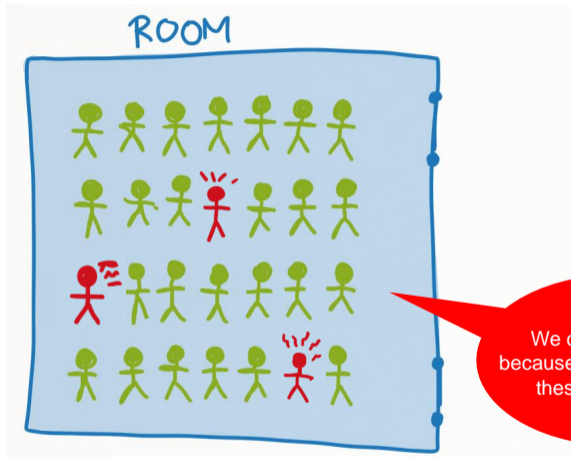
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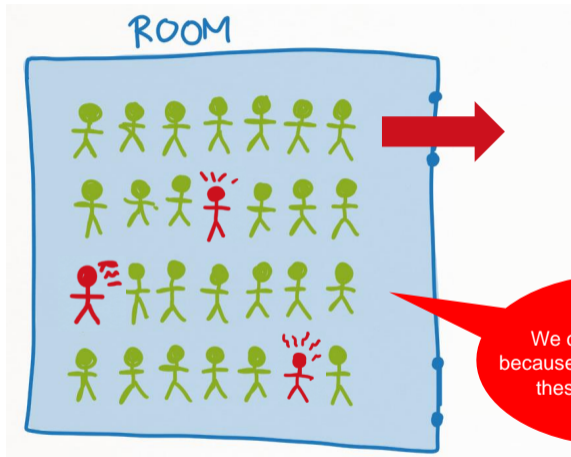
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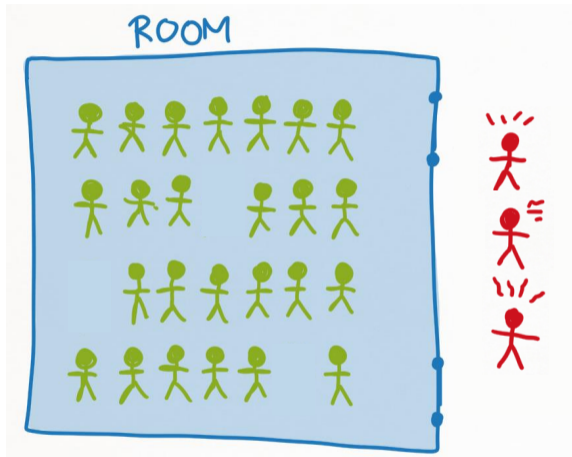
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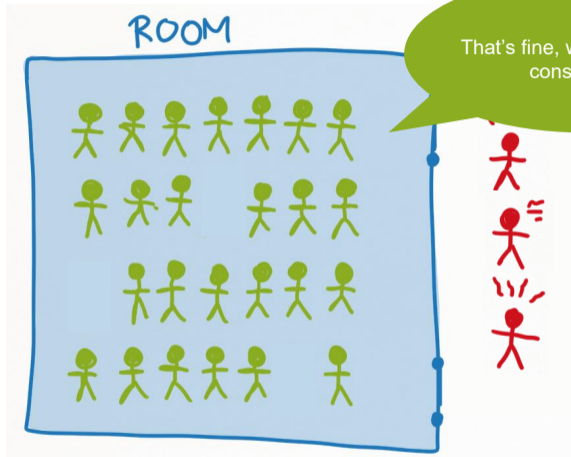
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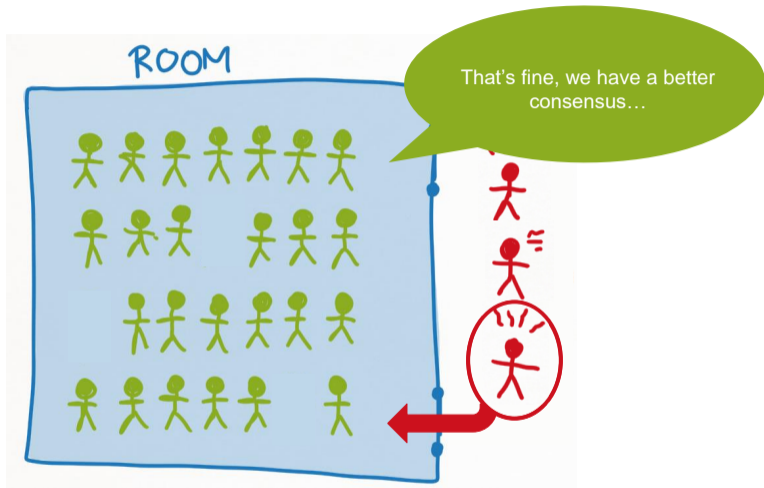
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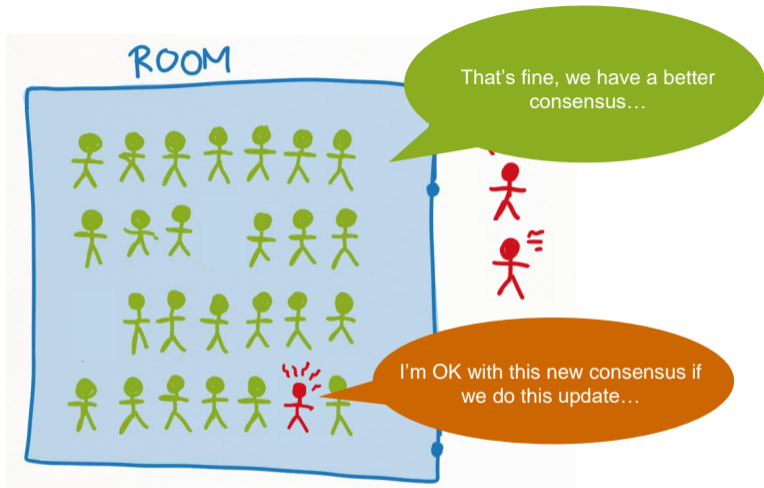
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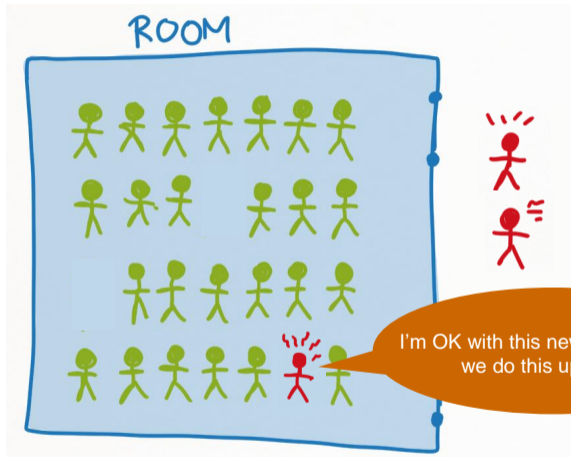
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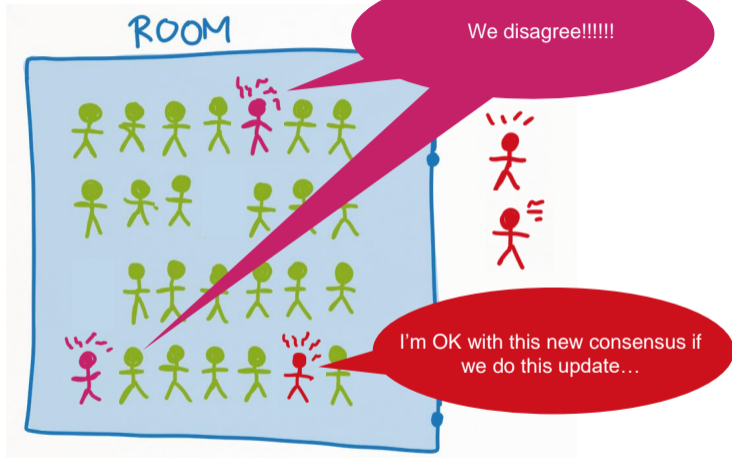
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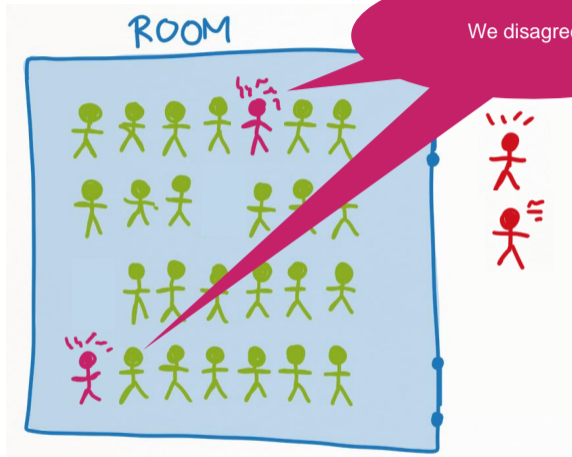
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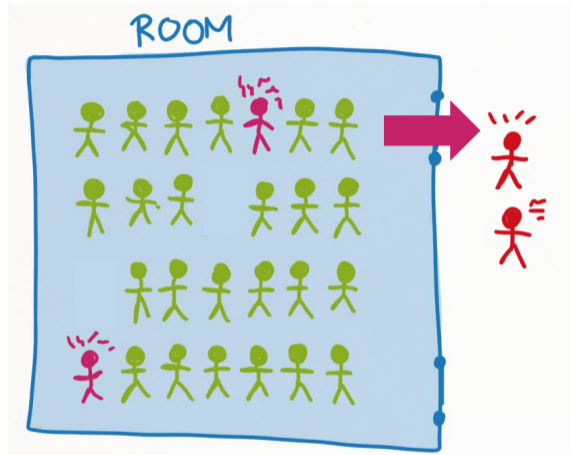
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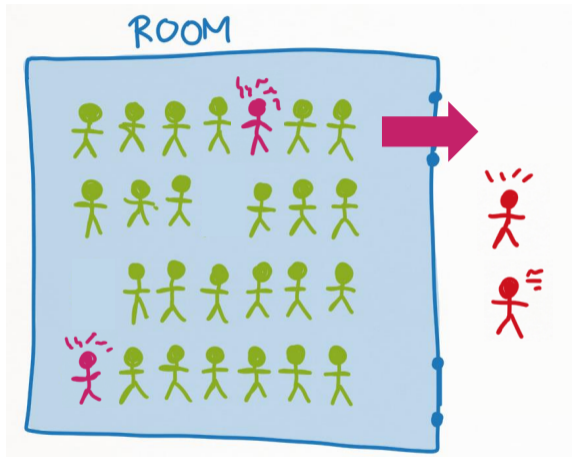
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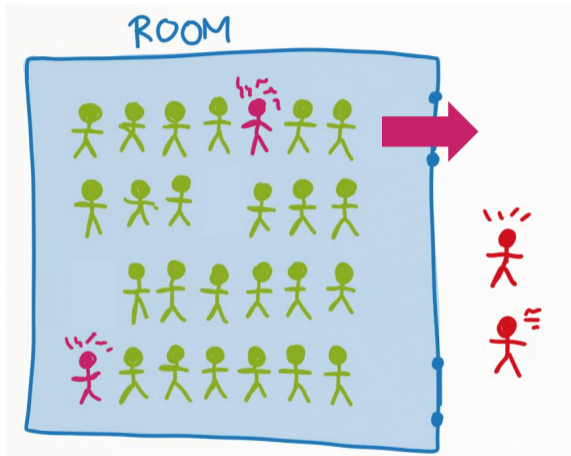
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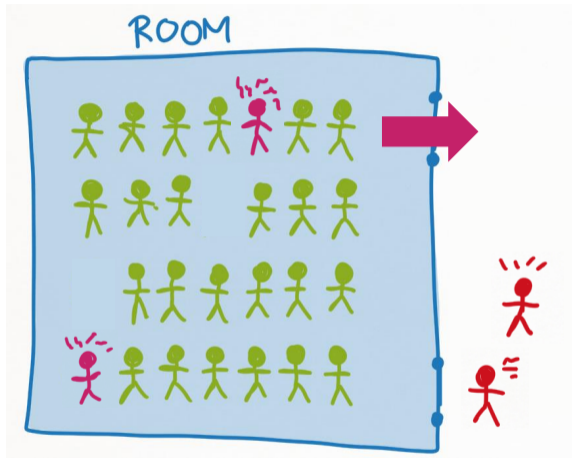
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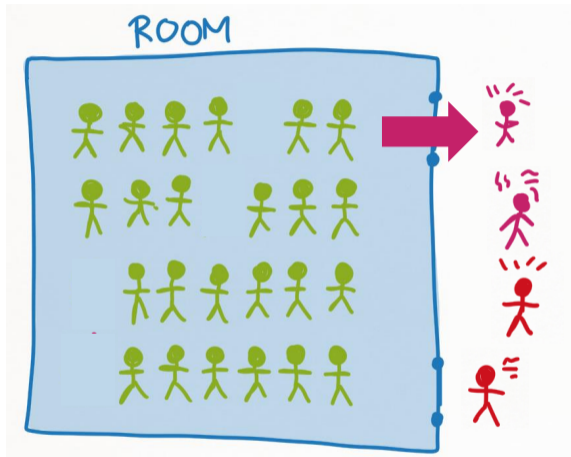
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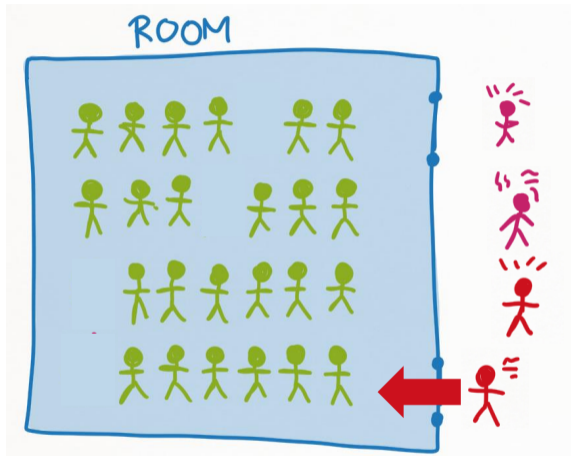
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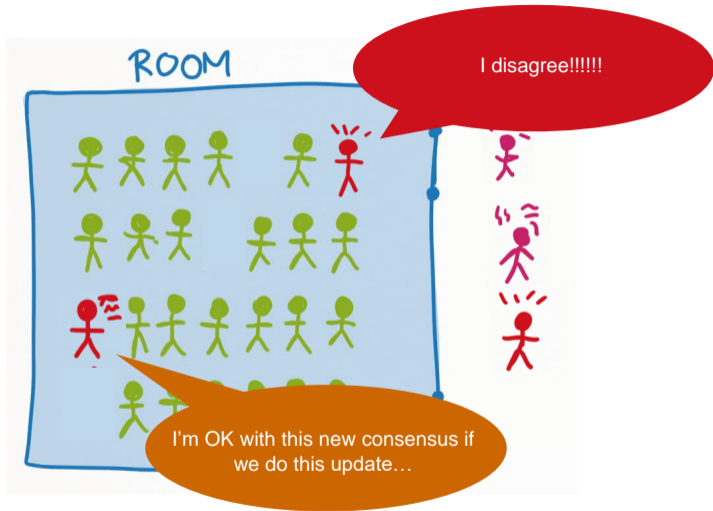
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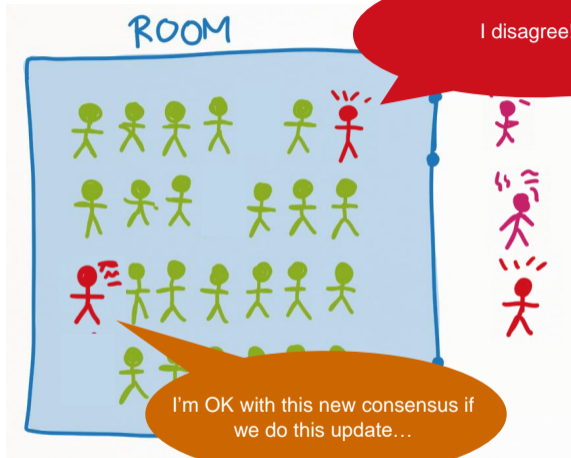
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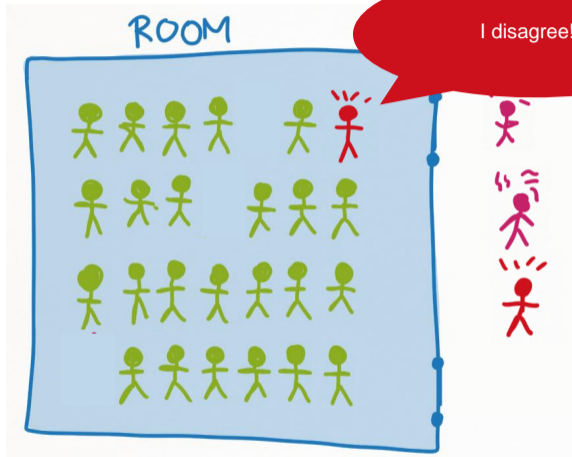
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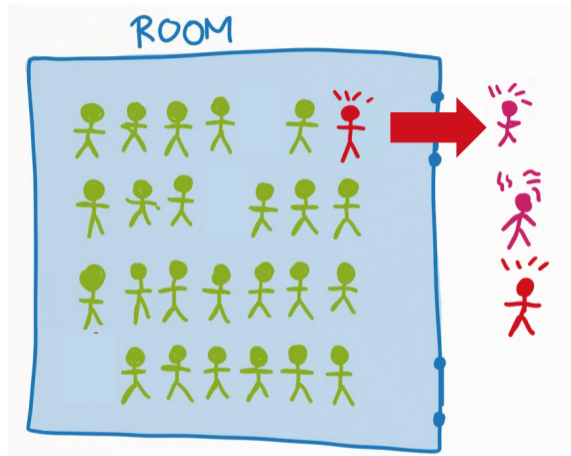
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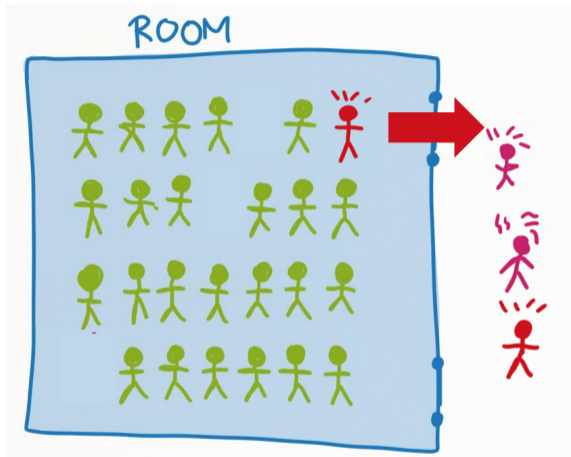
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28 agents in a room: find the best consensus to a complex combinatorial problem...

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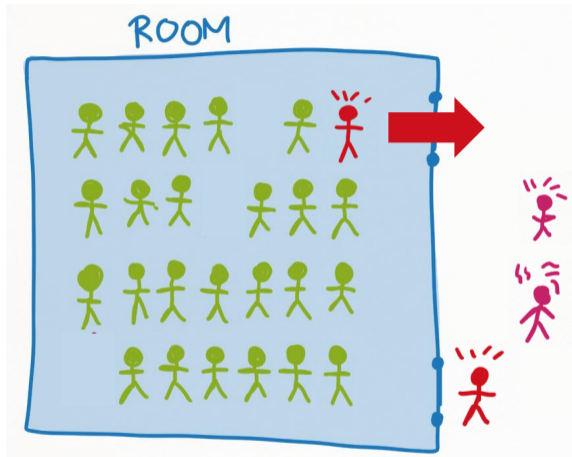
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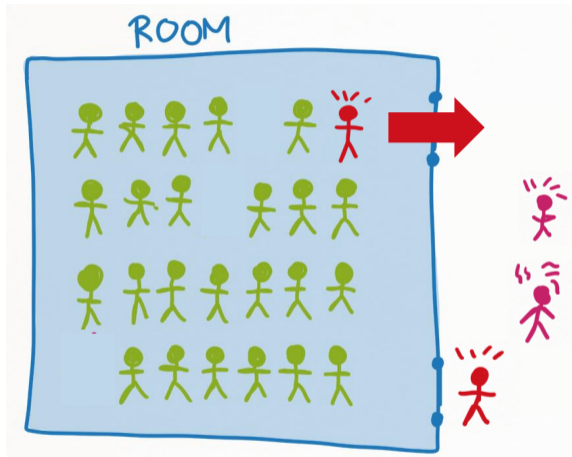
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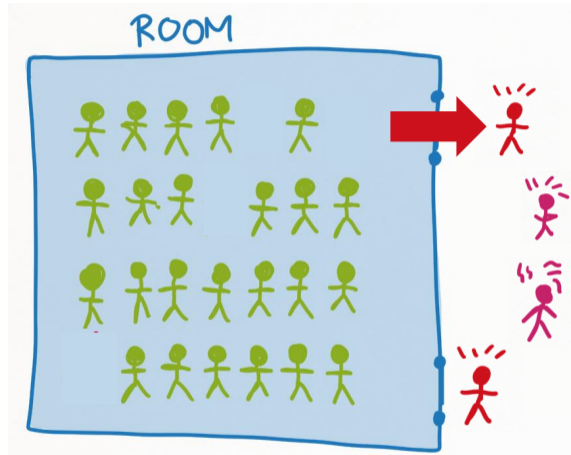
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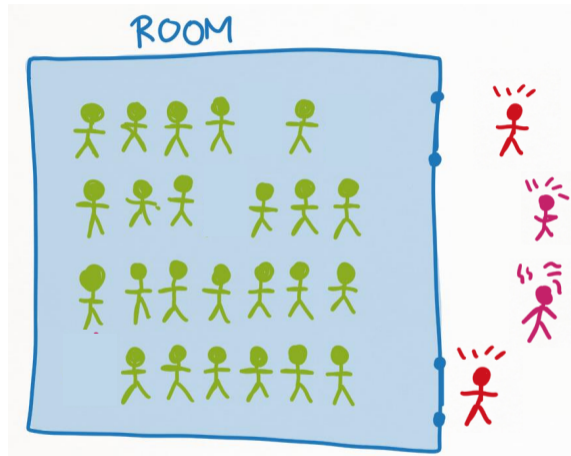
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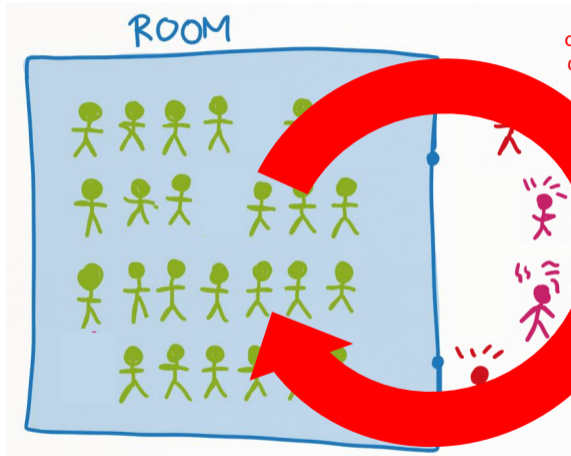
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Repeat thousands of times... until the new consensus is accepted by every agent....

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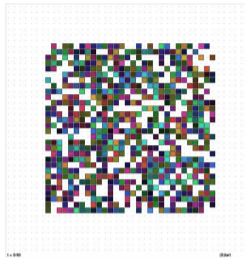
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What can we do to **optimize** a solution ?

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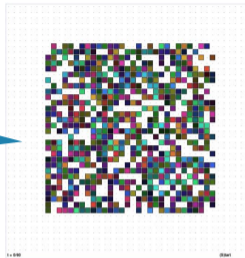
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Solution of
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Remove the robots arriving
at their target at $t=61$



All the other robots
arrive at $t \leq 60$

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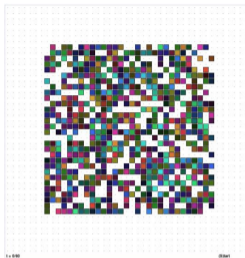
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Remove the robots arriving
at their target at $t=61$

- Put the removed robots in a queue Q



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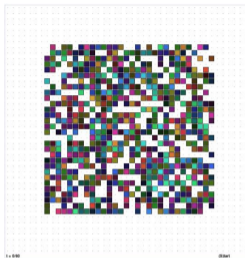
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Solution of
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Remove the robots arriving
at their target at $t=61$

- Put the removed robots in a queue Q

- Pick the first robot r_0 of the queue
search for a path P arriving at time $t=60$
with a minimum number of conflicts with other robots



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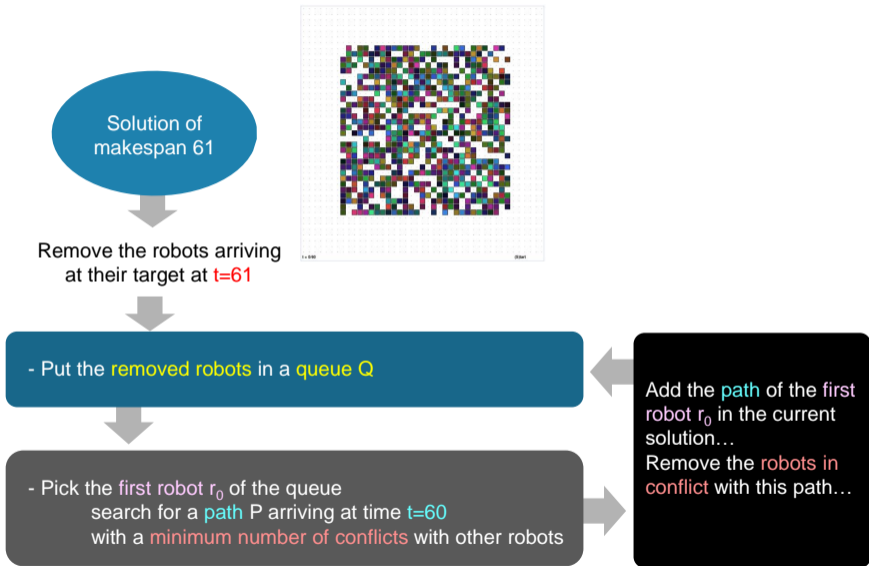
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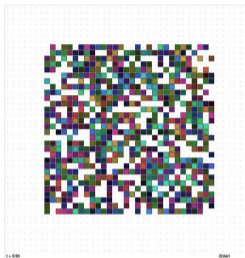
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Solution of
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Remove the robots arriving
at their target at $t=61$

- Put the removed robots in a queue Q

- Pick the first robot r_0 of the queue
search for a path P arriving at time $t=60$
with a minimum number of conflicts with other robots

Add the path of the first
robot r_0 in the current
solution...
Remove the robots in
conflict with this path...

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- Put the **removed robots** in a **queue Q**

- Pick the **first robot** r_0 of the queue
search for a **path P** arriving at time **$t=60$**
with a **minimum number of conflicts** with other robots

Add the **path** of the first robot r_0 in the current solution...

Remove the **robots in conflict** with this path...

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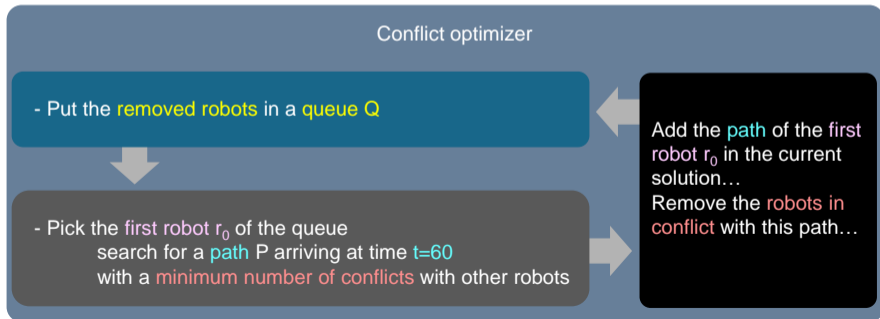
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Loops

robot r_0 excludes robot r_1
robot r_1 excludes robot r_0
robot r_0 excludes robot r_1
....

Conflict optimizer

- Put the removed robots in a queue Q

- Pick the first robot r_0 of the queue
search for a path P arriving at time $t=60$
with a minimum number of conflicts with other robots

Add the path of the first robot r_0 in the current solution...

Remove the robots in conflict with this path...

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We add weights
(each robot has a weight)

Loops

robot r_0 excludes robot r_1
robot r_1 excludes robot r_0
robot r_0 excludes robot r_1
....

Conflict optimizer

- Put the **removed robots** in a **queue Q**

- Pick the first robot r_0 of the queue
search for a **path P** arriving at time **$t=60$**
with a **minimum number of conflicts** with other robots

Add the **path** of the first robot r_0 in the current solution...
Remove the **robots in conflict** with this path...

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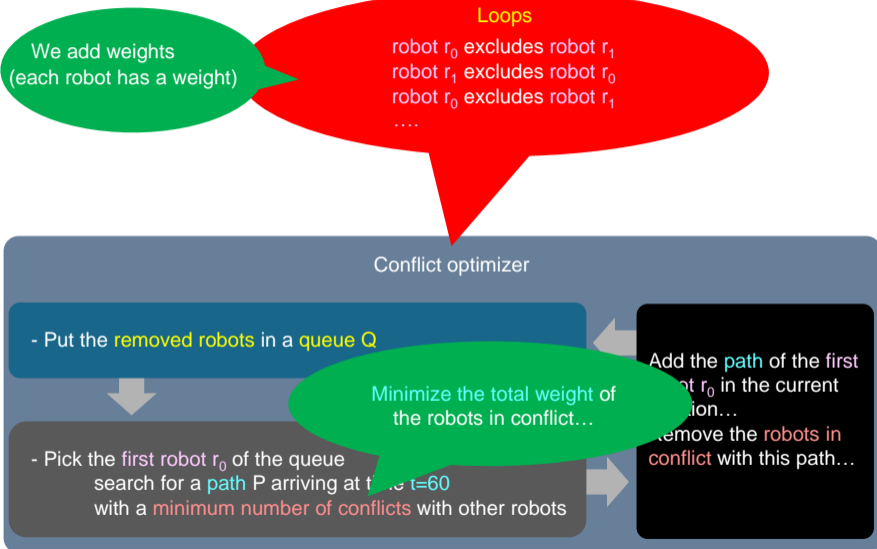
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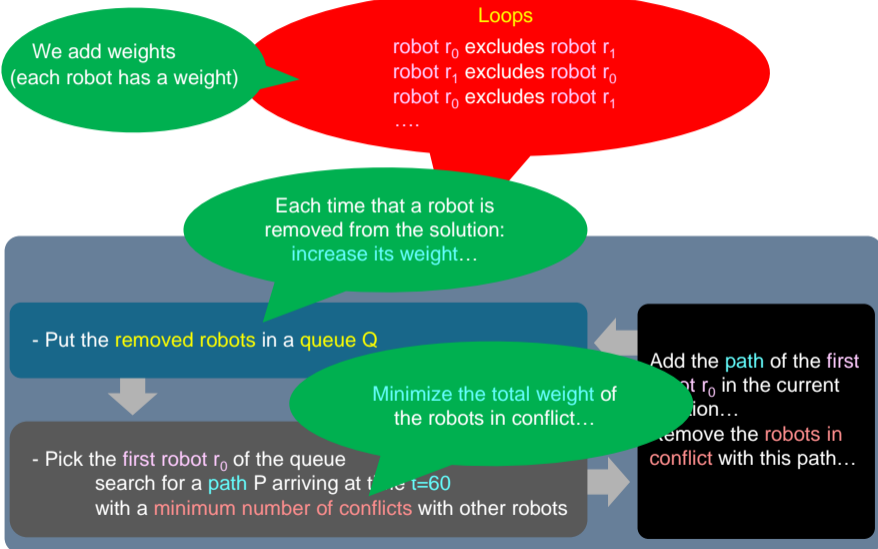
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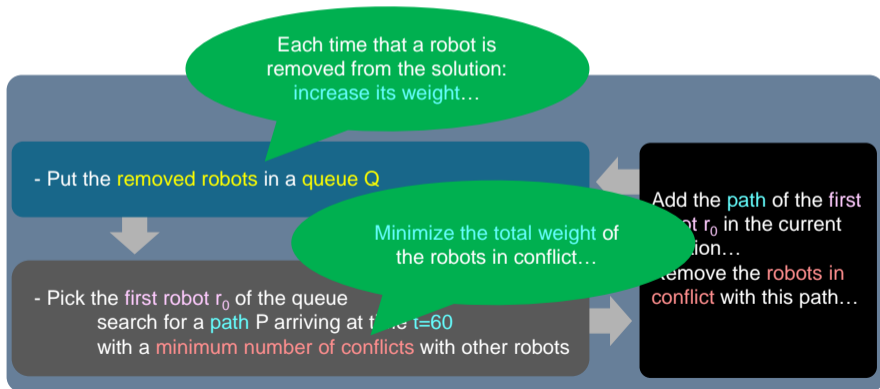
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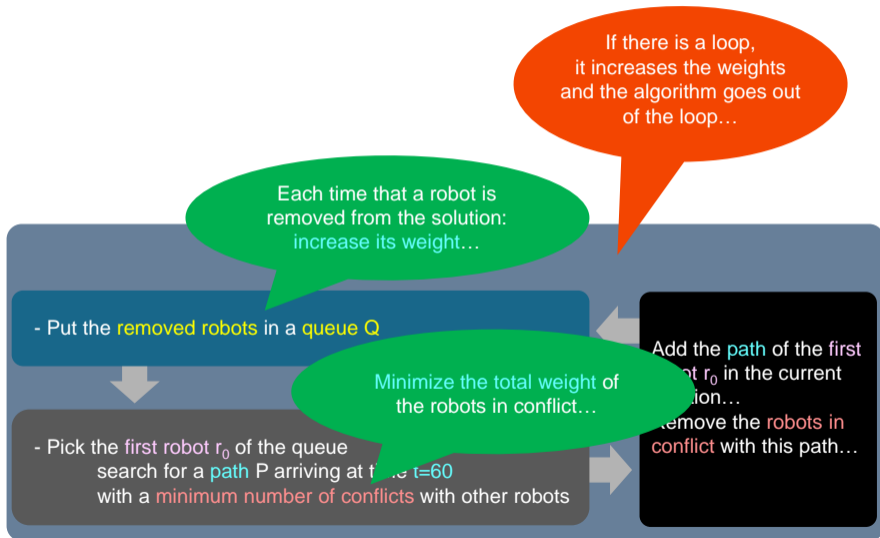
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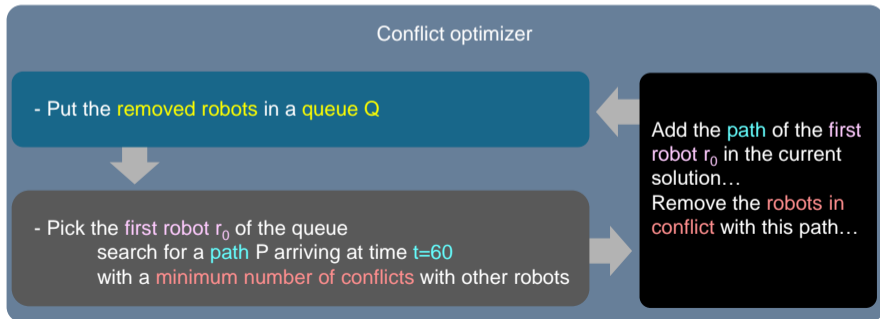
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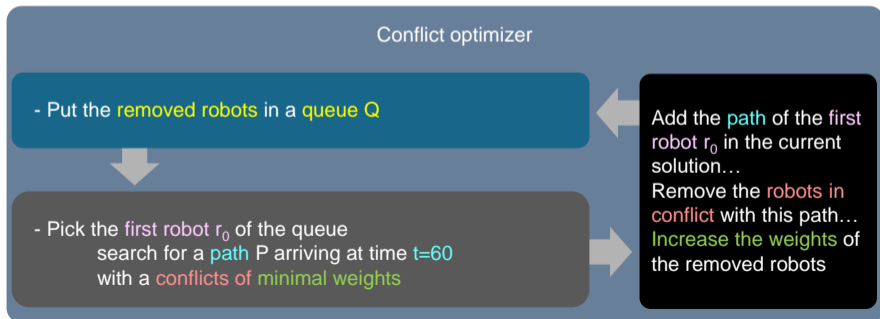
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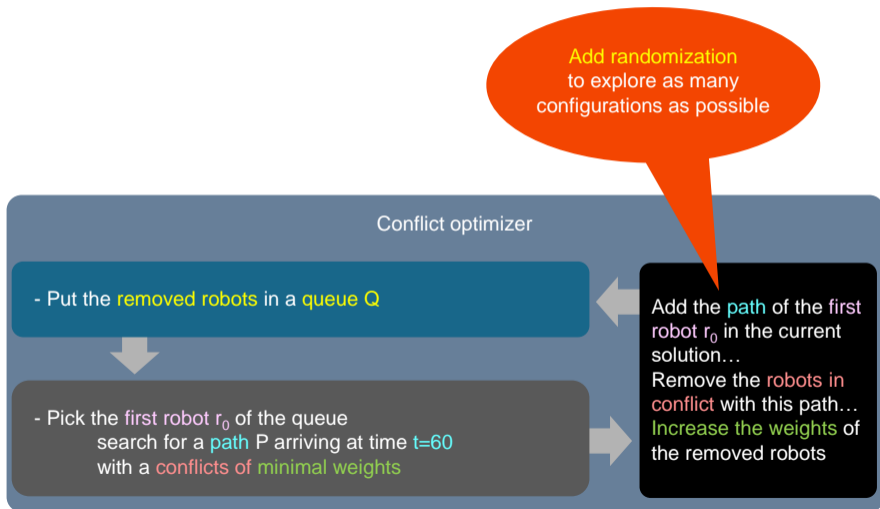
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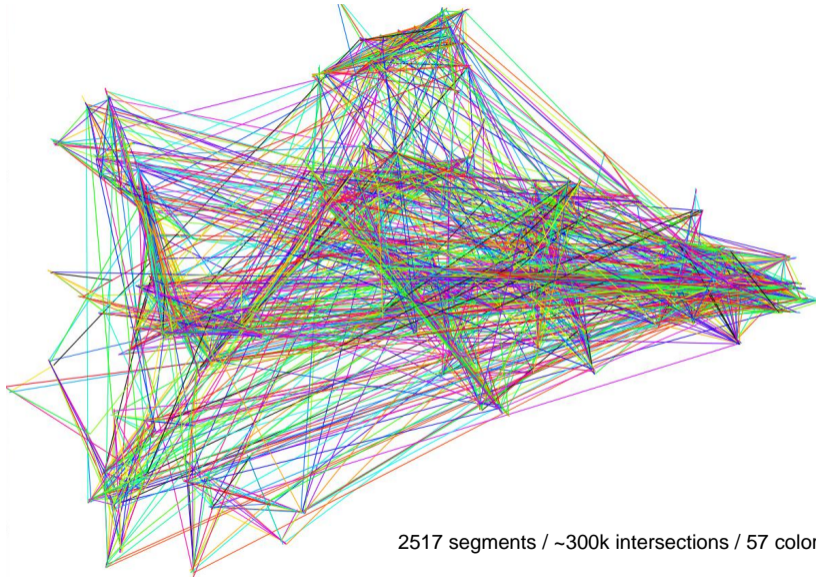
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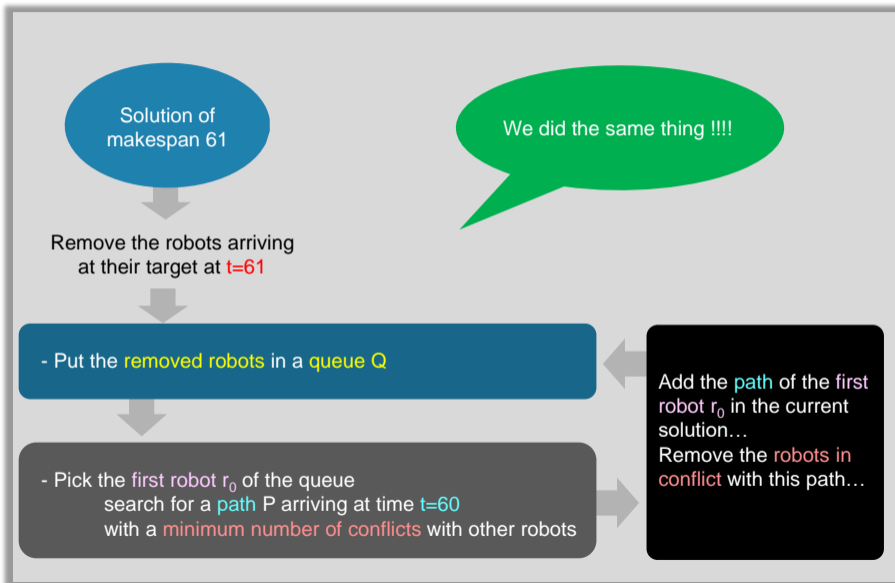
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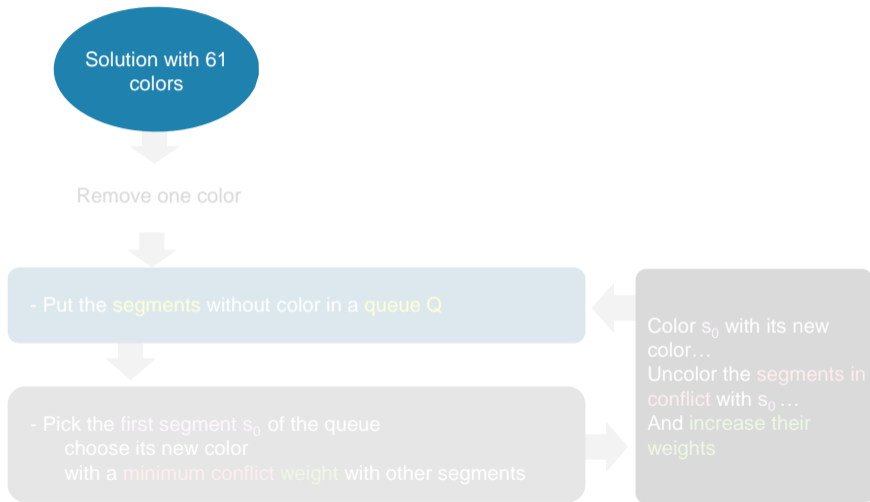
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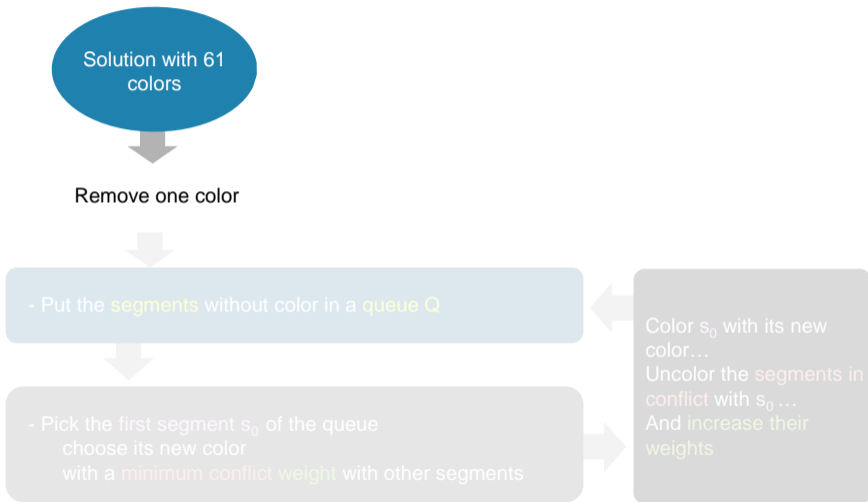
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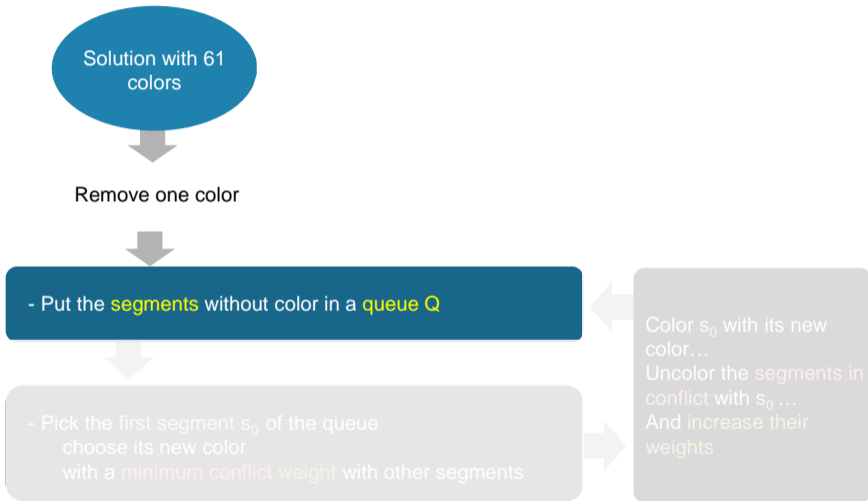
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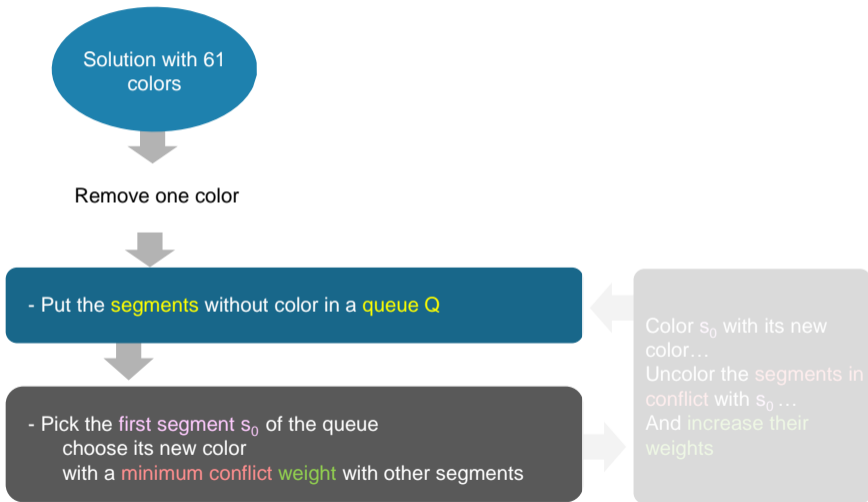
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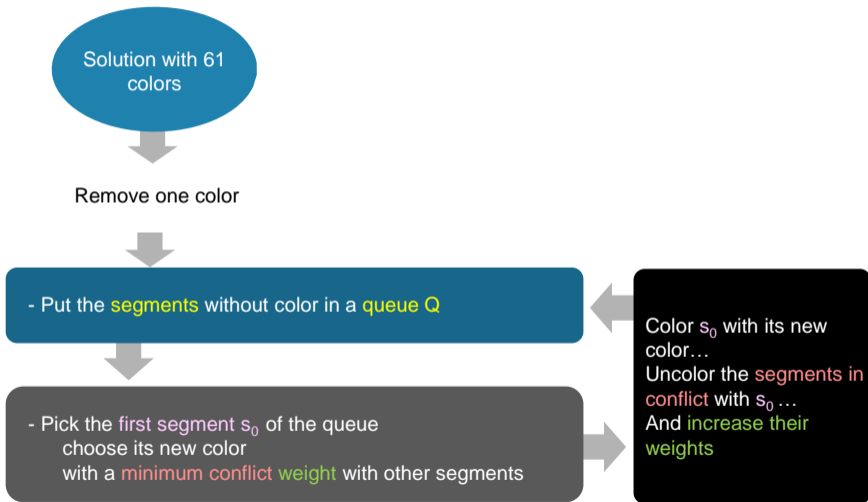
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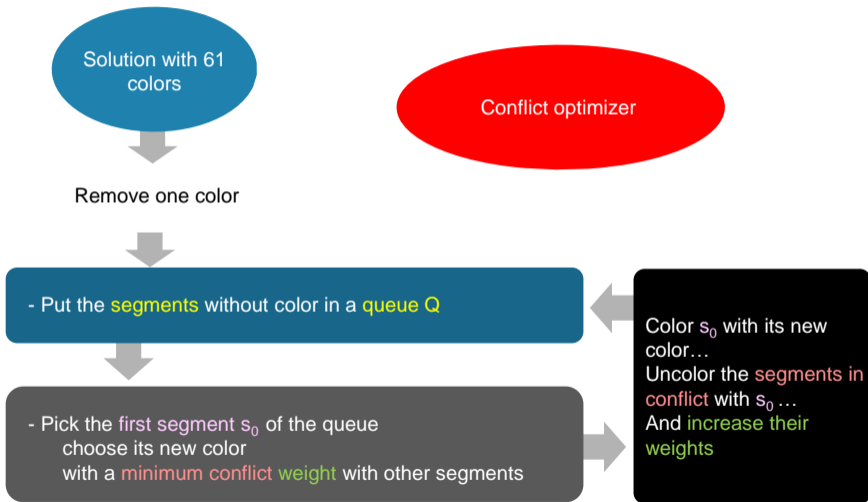
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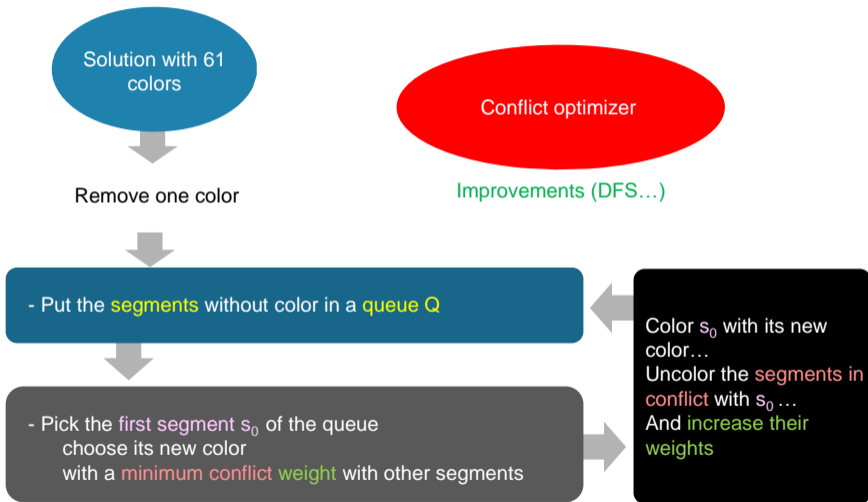
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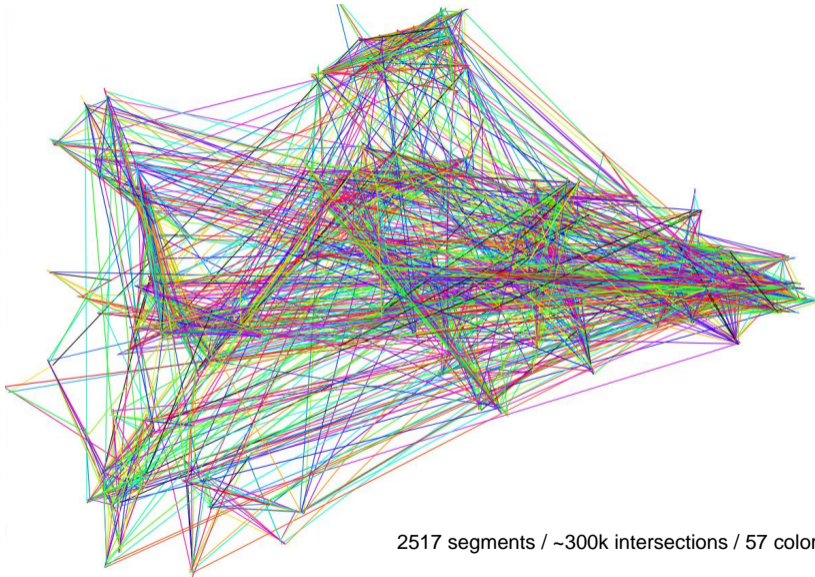
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What did we get with these algorithms?

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The (very hard) problem
of going
on vacation

Maximum Area Polygon

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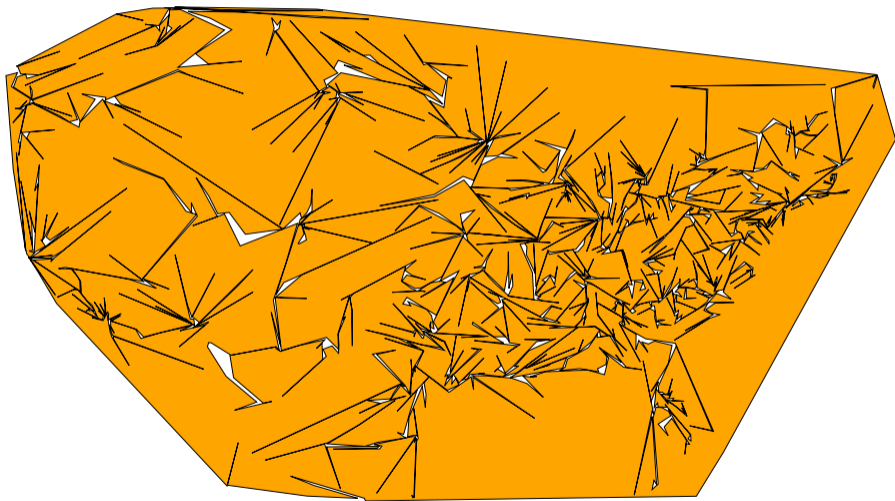
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Minimum Area Polygon

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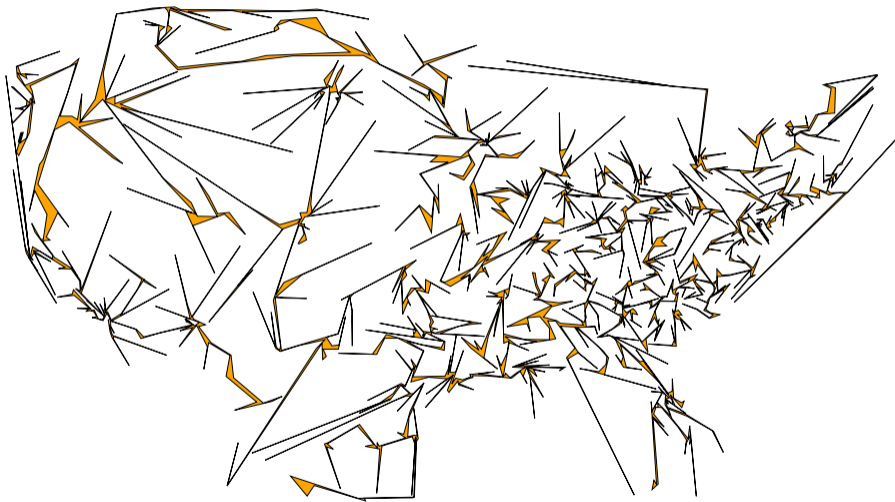
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Segment Intersection Graph Coloring and Clique

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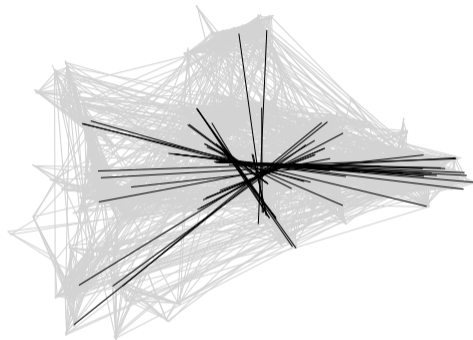
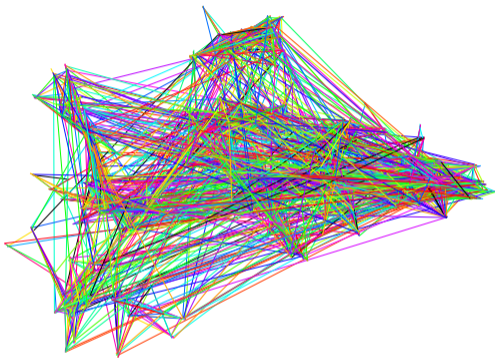
Packing

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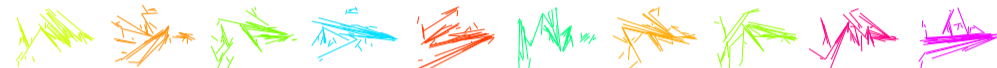
Each Color Class (Interior-Disjoint Segments)

Shadoks



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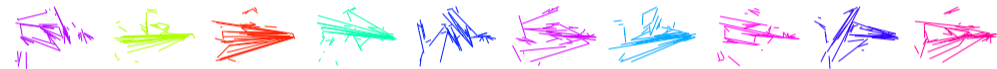


1-Greedy

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Packing

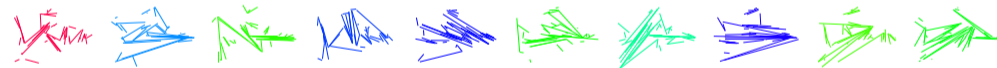
Coloring



1-IP

Packing

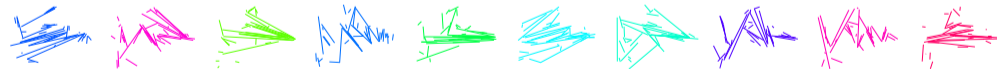
ConvexCover



2-IP

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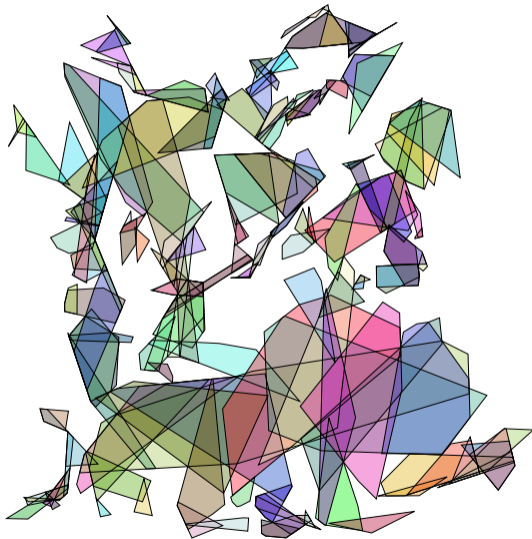
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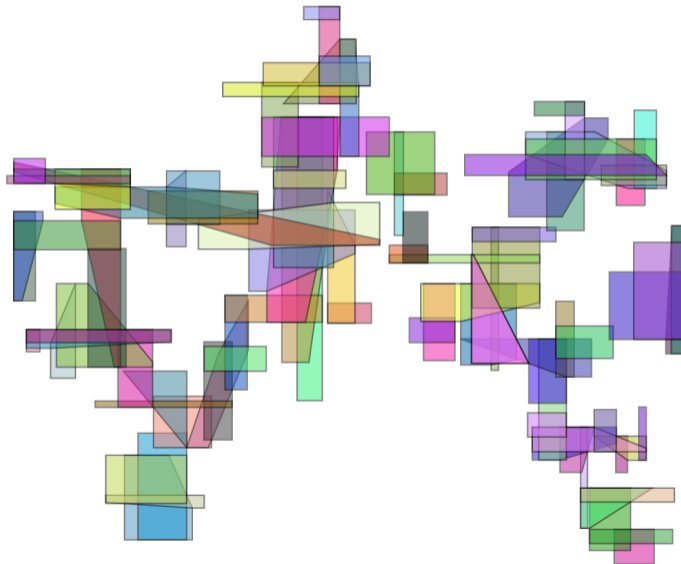
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Packing (50 items)

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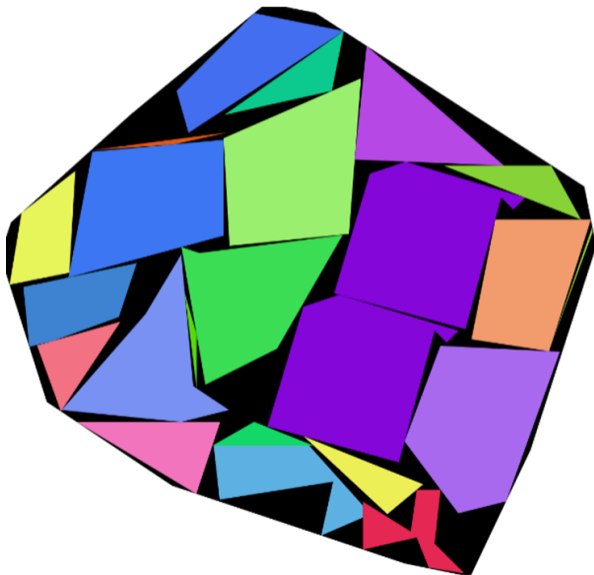
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Packing (335 items)

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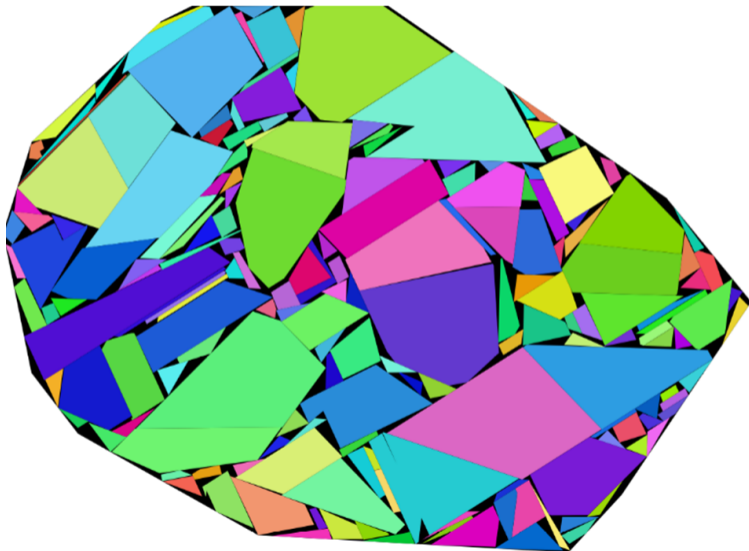
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Packing (500 items)

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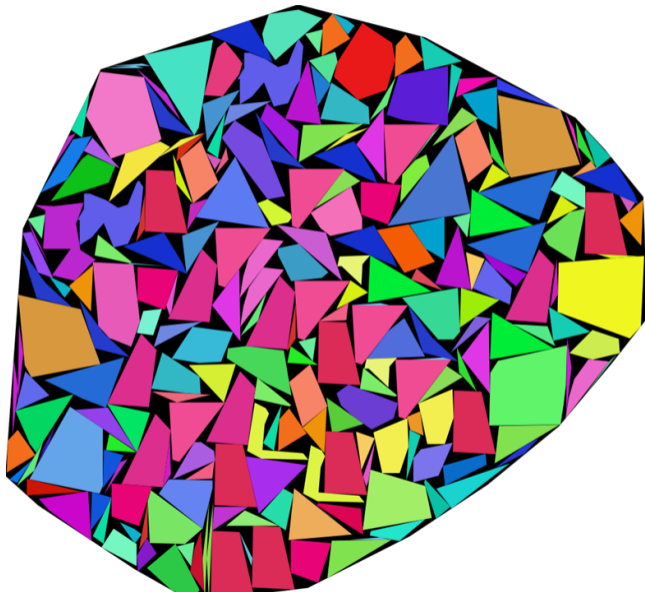
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Packing 1000 items)

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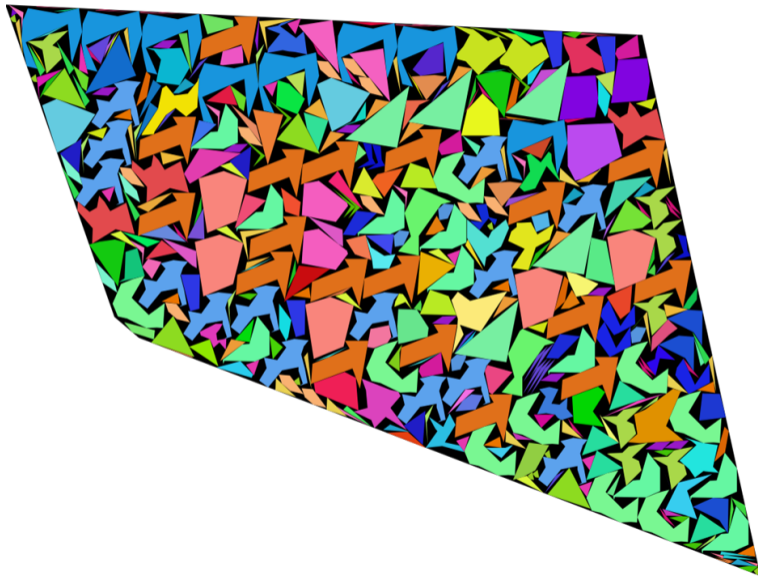
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Packing (1240 items)

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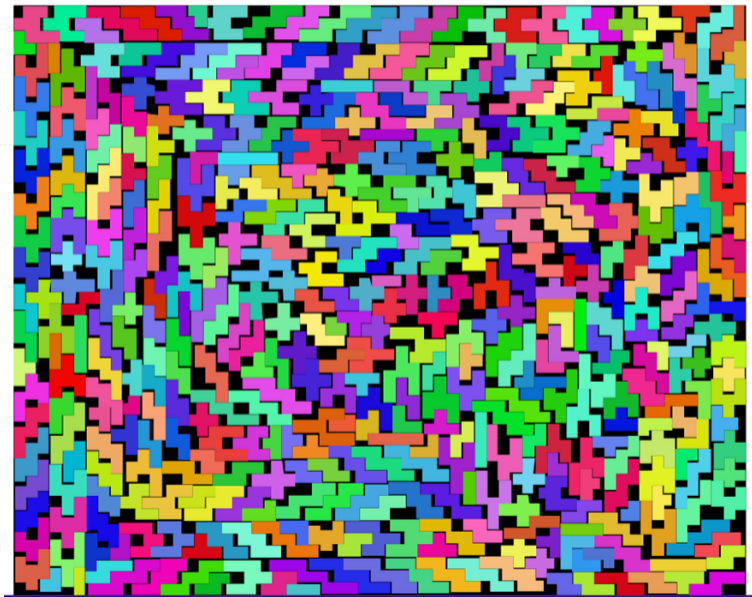
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Packing (1672 items)

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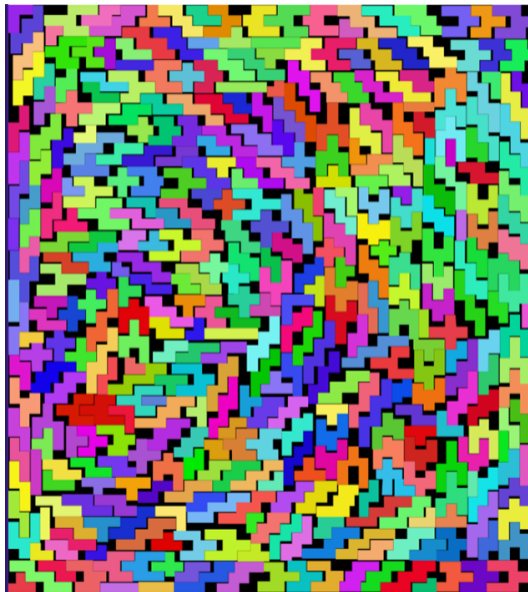
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Packing (1685 items)

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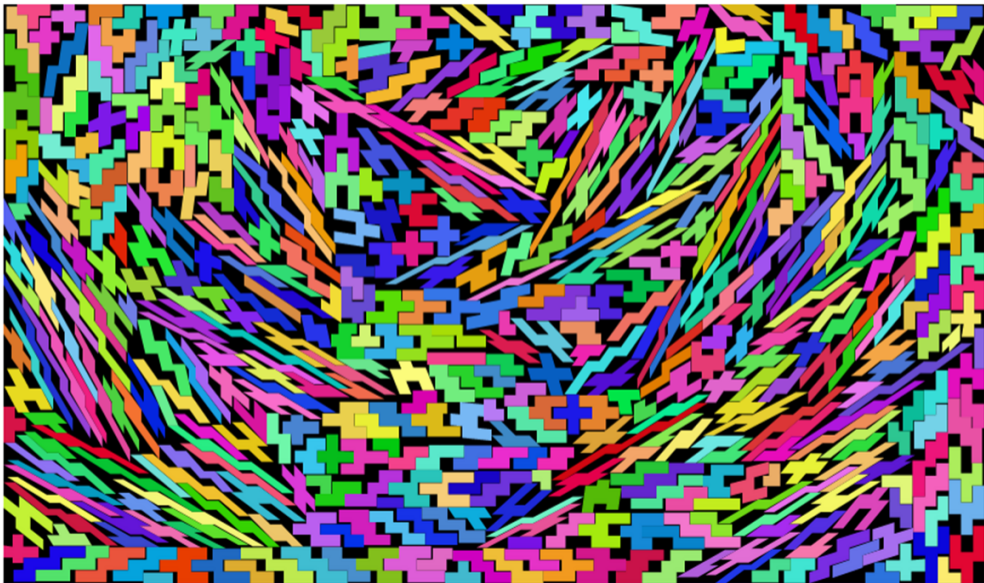
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Packing (2000 items)

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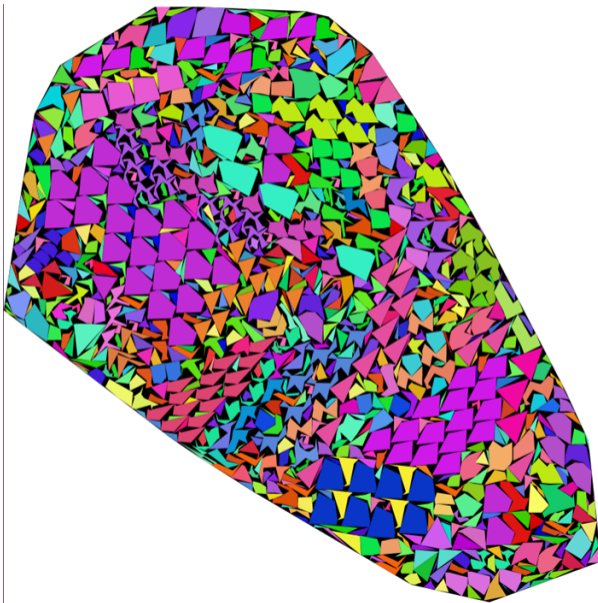
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Packing (3000 items)

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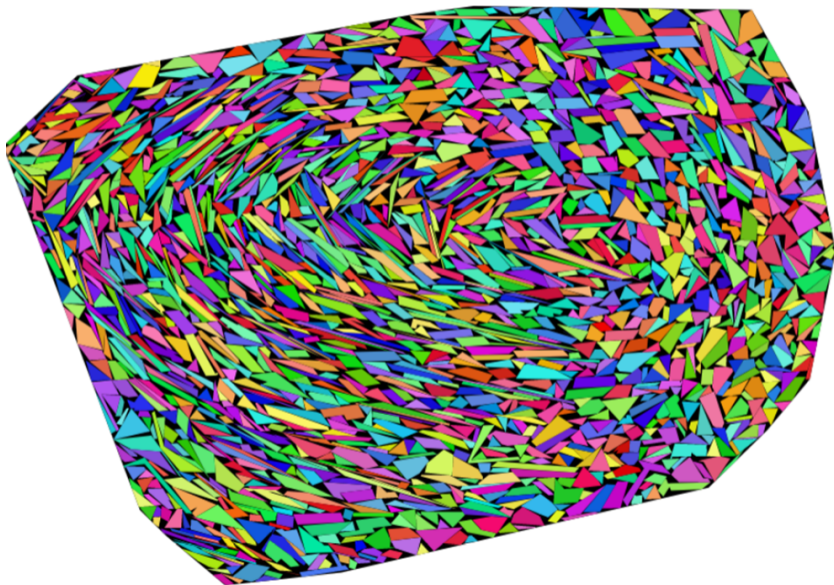
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Packing (5000 items)

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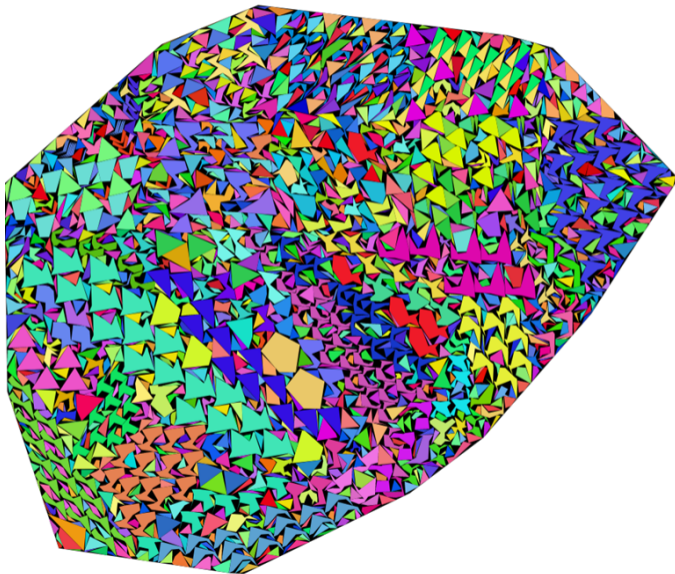
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Packing (10000 items)

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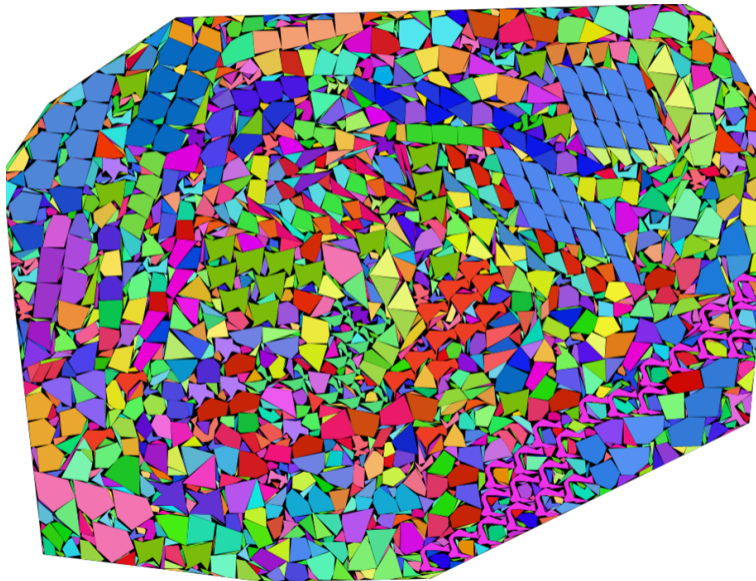
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Packing (10000 items)

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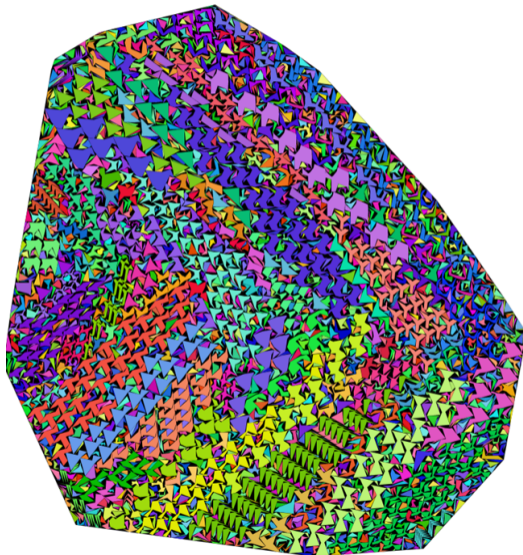
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Packing (50000 items)

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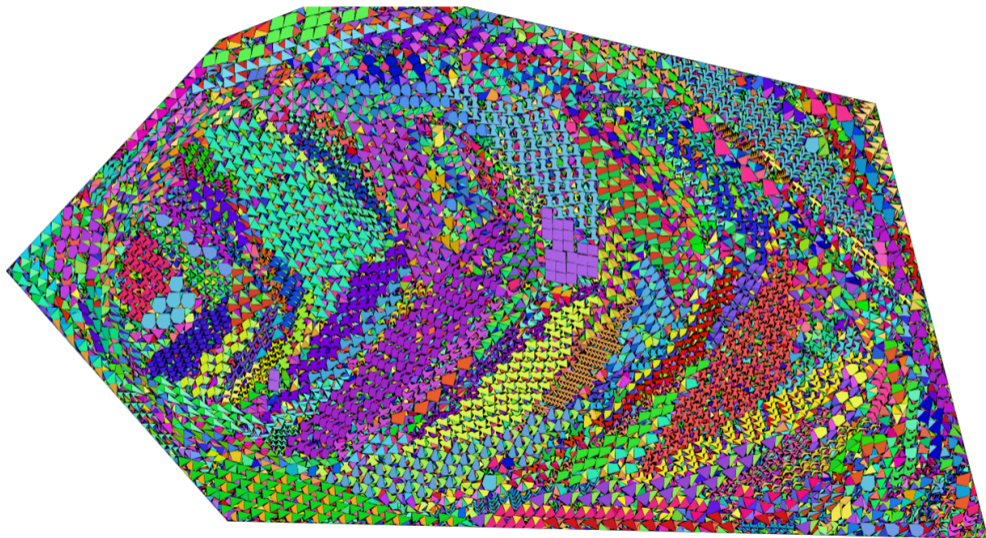
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Packing (50000 items)

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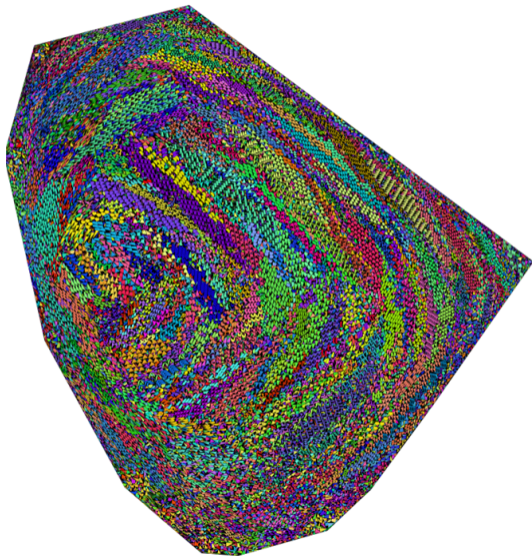
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Thank You!

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Art by @maryanneshakyhand