



# Local symmetry detection in Earth observation (EO) data

## Progress report

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# Motivation

GeoSym Objective O3: *Integration of symmetry detection into the methodology of semantic segmentation and object recognition in EO data in order to improve accuracy and enlarge the set of recognized classes, validated in a dedicated set of applications.*

Due to the nature of EO data and their acquisition, it seems that only the local & approximate symmetry detection can realize O3. While waiting for adequate solutions from Pilsen, we are trying to provide some inputs (local reflectional and rotational symmetries in EO data) ourselves.

# EO data

- 1) **Sampled data**
  - Discrete point cloud, voxel or raster grid...
- 2) **Top view**
  - 3D data, (mostly) acquired „down“ from a satellite, airplane...
  - Much more data collected from the visible top faces than from the side and bottom faces.
  - Lower (side and bottom) points may be included in datasets, depending on view angle and/or multiple reflections.
- 3) Usually, **width and length of the considered area are much greater than the range of altitudes.**
  - Bigger geographic areas are relatively flat.
  - 2D or 2.5D data. Altitude as an attribute in 2D GIS data.

# EO data

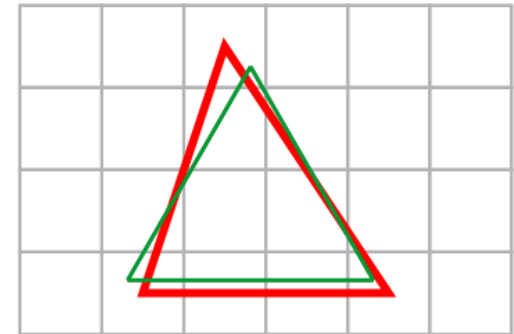
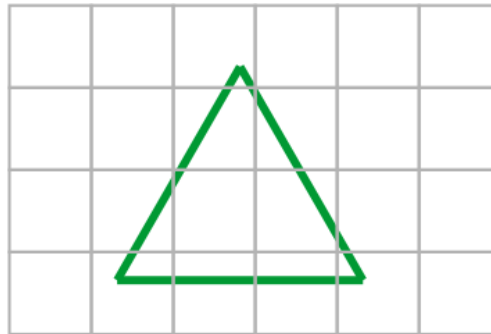
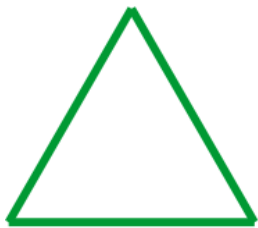
- ▶ Implications on symmetry detection
  1. Due to sampling: points of an „original“ part and mirrored/rotated part(s) rarely match exactly.
  2. Due to higher density of data on visible top sides: it is more likely to detect symmetric parts there.
  3. Due to „flatness“ of acquired areas: more likely to explore symmetries from above than from side.
- ▶ For these reasons (and simplicity 😊), we initially focus on rotational and reflectional local symmetries with vertical symmetry axes/planes.
- ▶ GIS platform initially designed for 2D visualization, too.

# Concept

- ▶ Due to sampling and visibility limitations, **approximate** symmetries can only be considered.
  - Surface reconstruction, tollerances or **voxelization**?
  - Interval arithmetic must be defined.
- ▶ Due to restriction to vertixal symmetry axes/planes, it suffices to detect **2D symmetries in horizontal slices and then merge them** with respect to detected vertical symmetry axes/planes (and rotation angles).

# Voxelization

- ▶ Any point inside a voxel is replaced by the voxel's centre.
  - Left, front, bottom boundaries also part of the voxel.
- ▶ Voxels containing EO data points are **interesting voxels**.
- ▶ Straightforward, but...
- ▶ Lengths of line segments not preserved → relations lost.



- ▶ Example: an equilateral triangle turns into a scalene one!
- ▶ **Interval arithmetic!**

# Concept

- ▶ Bottom-up approach (in each slice): Find basic symmetries and construct larger ones by merging.
- ▶ **Basic symmetry**: symmetry (or candidate for symmetry) between two geometric primitives.
- ▶ Primitives to be used: points (voxels), line segments, or more complex structures? Our choice are line segments.
- ▶ **Line segment (LS)** is a pair of voxels (end-points of LS). It is characterized with its length and structure (distribution of interesting voxels along LS).
- ▶ Core idea is that **each LS which appears in some symmetry should have a symmetric pair** (copy) or more of them **with the same length** somewhere (in the slice).

# Concept

Voxelization.

For each horizontal slice of voxel space

- Identify interesting voxels (pixels in slice).

- Create complete graph  $G$  on the interesting voxels.

- Cluster edges of  $G$  with respect to lengths (and structure).

- For each cluster

  - Establish basic symmetries among pairs of edges.

  - Merge symmetries.

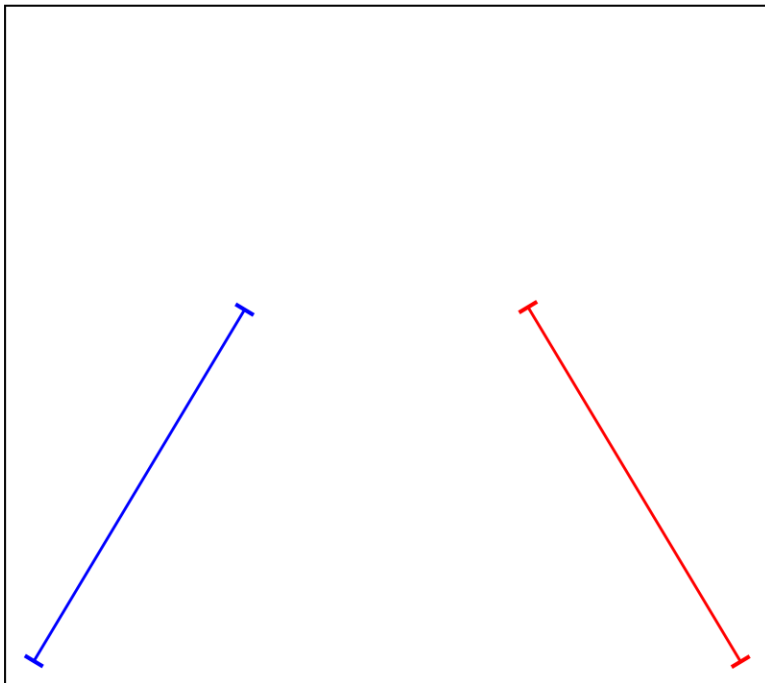
- Merge symmetries from different clusters.

Merge simmetries from different slices.



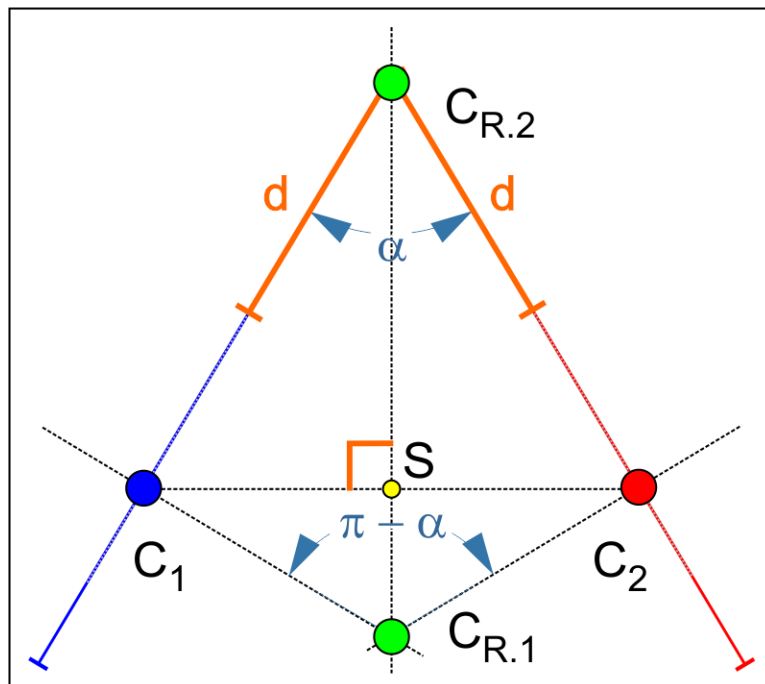
# Establishing basic symmetries

- ▶ Are two LSs OF THE SAME LENGTH candidates for either rotational or reflectional symmetry (or for both)?



# Establishing basic symmetries

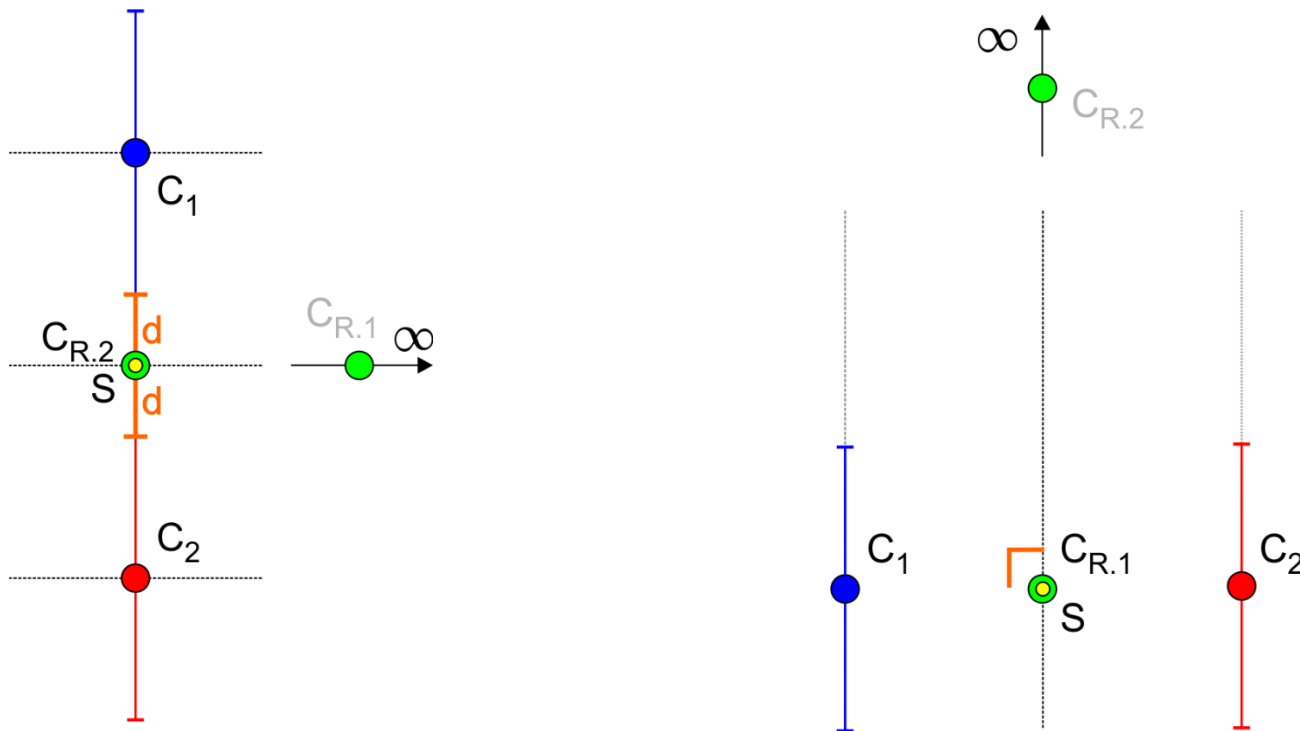
- ▶ Are two LSs OF THE SAME LENGTH candidates for either rotational or reflectional symmetry (or for both)?



- ▶ If both LSs are equidistant ( $d$ ) from the  $C_{R.2}$ , then  $C_{R.1}$  and  $C_{R.2}$  may be potential centres of rotational symmetries, and line  $(C_{R.1}, C_{R.2})$  is the axis of reflectional symmetry.
- ▶  $90^\circ$  in  $S$  is a consequence.
- ▶ Nice to simultaneously handle the reflectional and rotational symmetries!

# Establishing basic symmetries

- ▶ In both parallel exceptions, one candidate rotational symmetry confirmed (for 180° or fewer), another refused. Reflectional symmetry remains.



# Interval arithmetic

- ▶  $d(V_i, V_j) = [\min(d(p, q)), \max(d(p, q))]$
- ▶ Ok, but the problem is the **intersection detection** (point and angle) between two voxelised line segments.
- ▶ Particularly when two LSs are nearly parallel, there is quite a lot of intersection voxels, increasing the combinatorial complexity.
- ▶ While trying to solve (optimize) this problem, we (our students) have implemented another (brute-force) solution, at least to get some results.

# Concept 2

Voxelization.

For each horizontal slice of voxel space

Identify interesting voxels (pixels in slice).

For each pixel  $P$  as a potential centre of rotational symmetry

Detect rotational symmetries for different radii around  $P$ .

Merge detected rotational symmetries.

For each potential axis of reflectional symmetry<sup>(\*)</sup>

Detect mirror-symmetric pairs of voxels.

Merge symmetries from different slices.<sup>(\*\*)</sup>

<sup>(\*)</sup> Potential axis is any LS between a pair of pixels on different edges of the bounding rectangle.

<sup>(\*\*)</sup> Two rotational symmetries with the same axis and with the rotation steps  $s$  and  $k*s$  may/must be merged into the symmetry with the step  $s$ .

Gray lines are the same as in the initial concept.

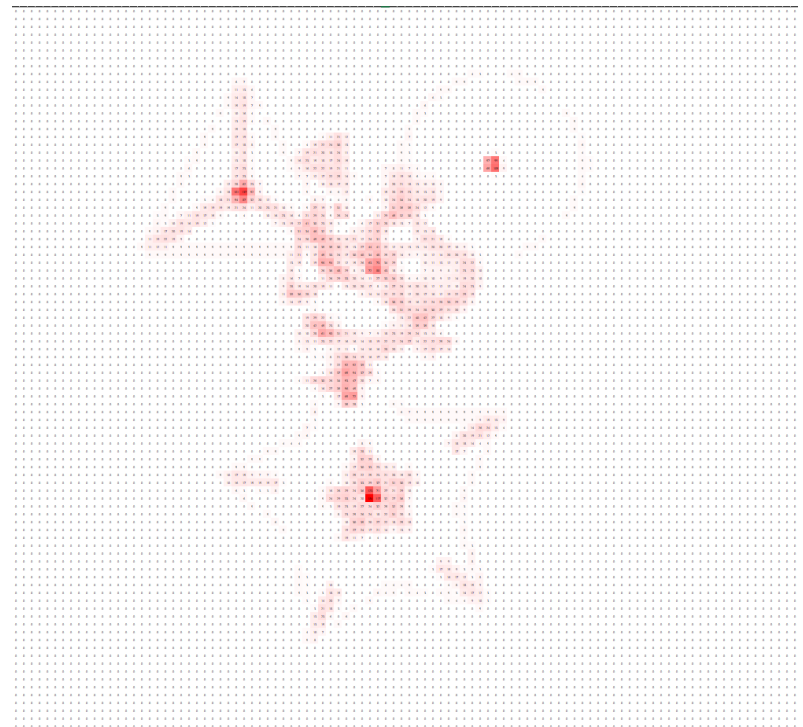
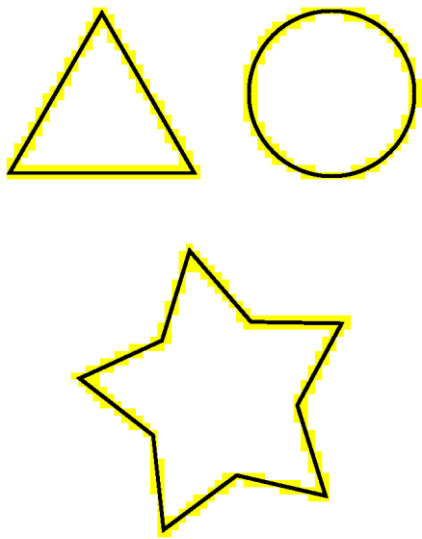
► Polynomial time, but quite slow.

# Concept 2: results

- ▶ 2D rotational symmetry:
  - Implemented, visualised, tested, **presented & analysed**.
  - **Below 5 sec** for presented cases with 10.000 pixels
- ▶ 2D reflectional symmetry:
  - Implemented, visualized, being tested.
- ▶ 3D rotational symmetry:
  - Implemented, tested, being visualized
  - Few minutes for 10.000 pixels; depending on altitude range.
- ▶ 3D reflectional symmetry:
  - Being in the implementation phase.

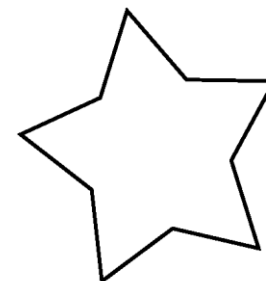
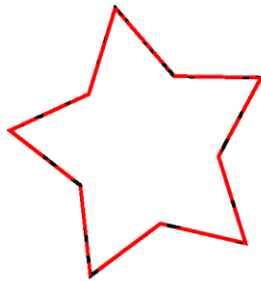
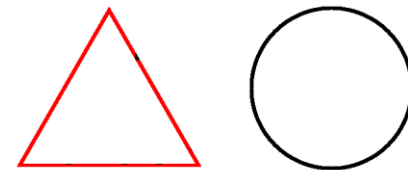
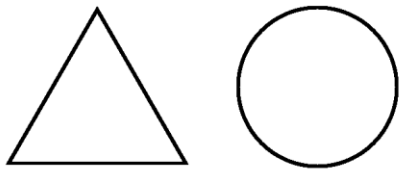
# Concept 2 (2D rotational): test 1

- ▶ Left: scene (black) and interesting voxels (yellow)
- ▶ Right: centres of detected symmetries (darker is stronger).



# Concept 2 (2D rotational): test 1

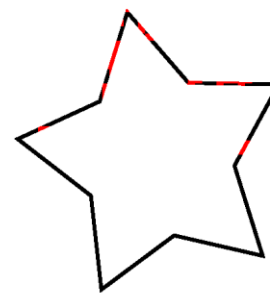
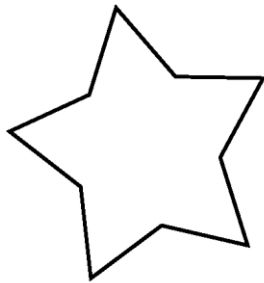
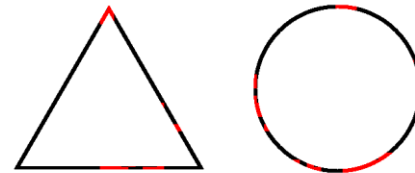
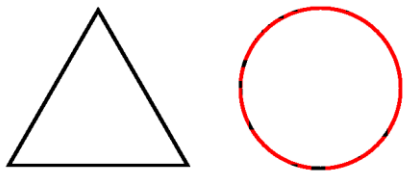
- ▶ Two strongest symmetries (due to number of interesting voxels involved): left of 5 rotations, right of 3 rotations.





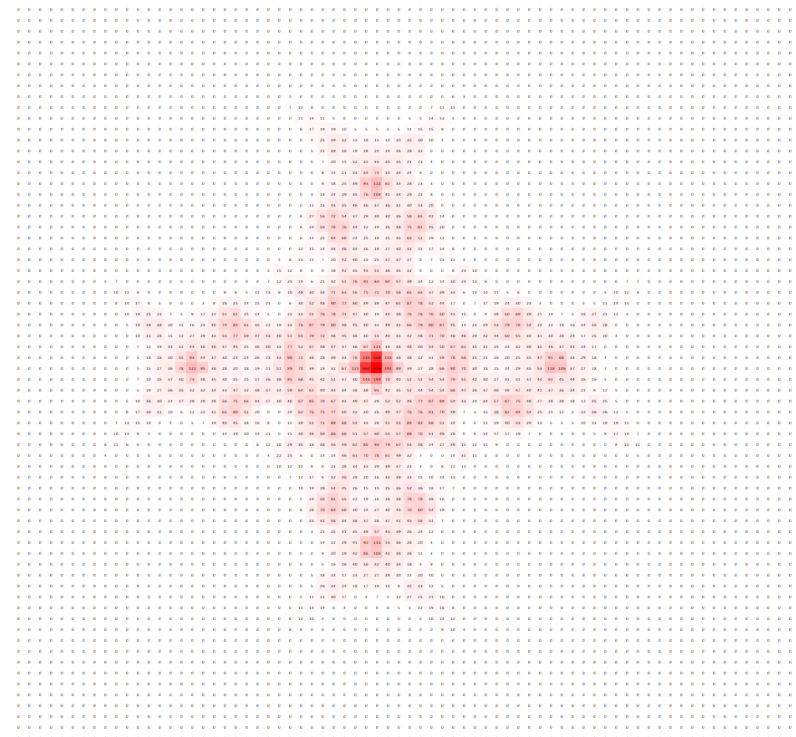
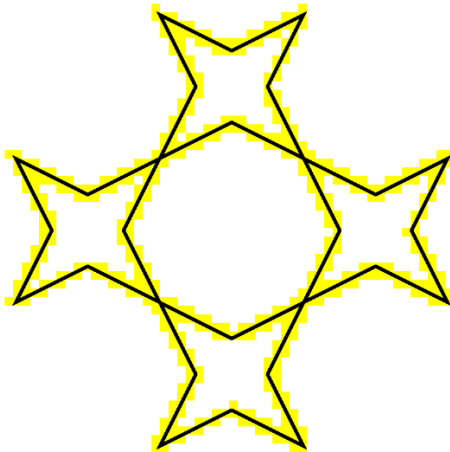
# Concept 2 (2D rotational): test 1

- ▶ Third and fourth strongest symmetries: left of „ $\infty$ “ rotations, right irrelevant case due to objects interference.



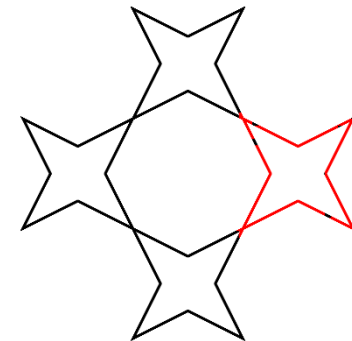
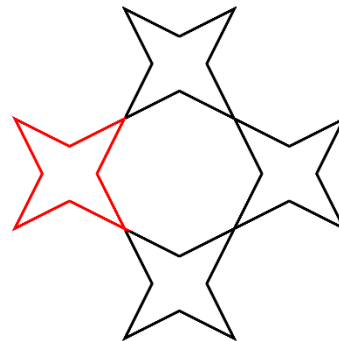
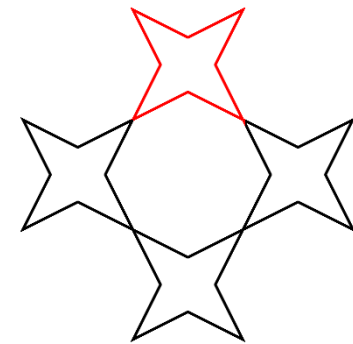
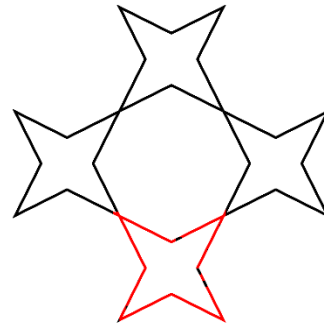
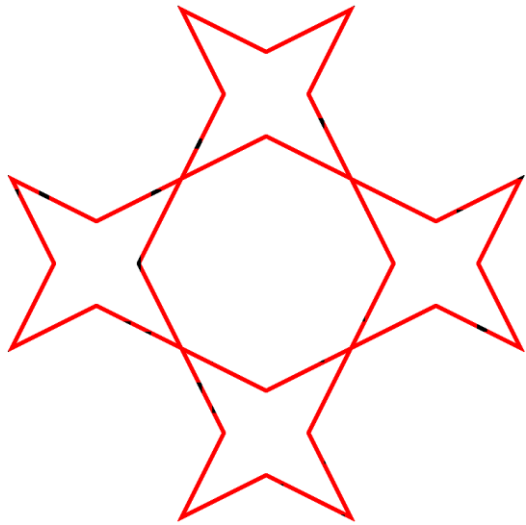
# Concept 2 (2D rotational): test 2

- ▶ Left: scene (black) and interesting voxels (yellow)
- ▶ Right: centres of detected symmetries (darker is stronger).



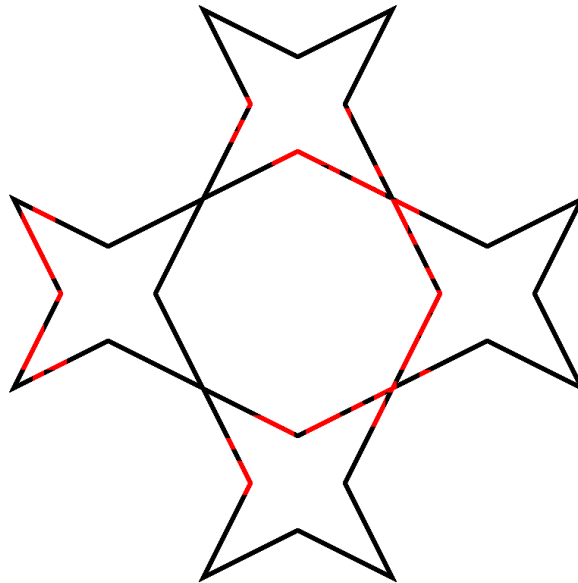
# Concept 2 (2D rotational): test 1

- ▶ Five strongest symmetries (all of rotation step 4)



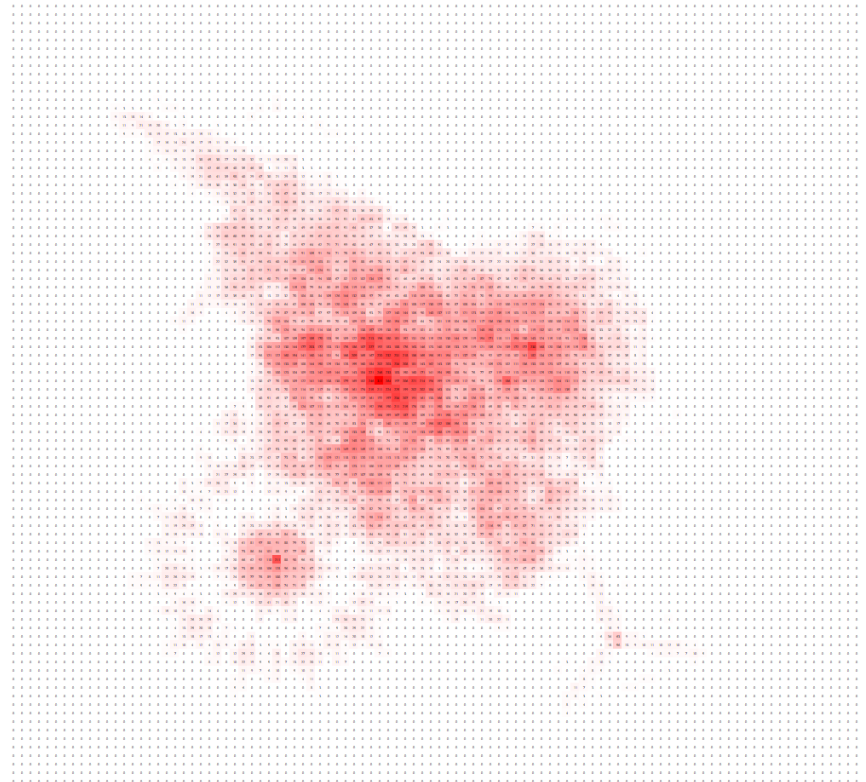
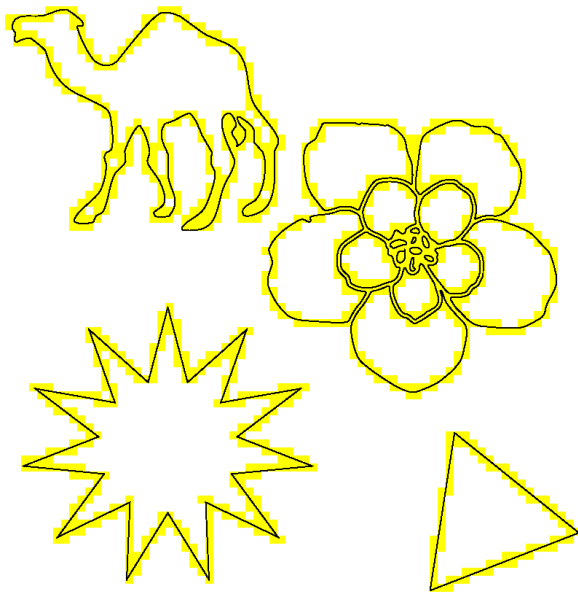
# Concept 2 (2D rotational): test 2

- ▶ 6th strongest symmetry (inter-object, irrelevant)



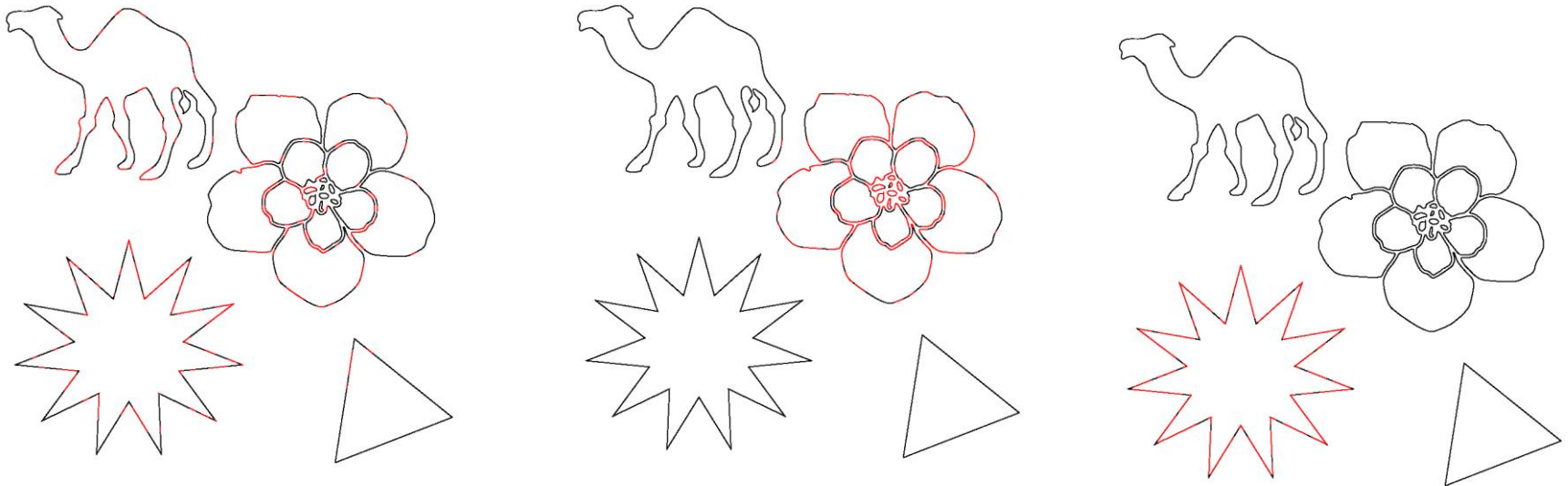
# Concept 2 (2D rotational): test 3

- ▶ Left: scene (black) and interesting voxels (yellow)
- ▶ Right: centres of detected symmetries (darker is stronger!!!).



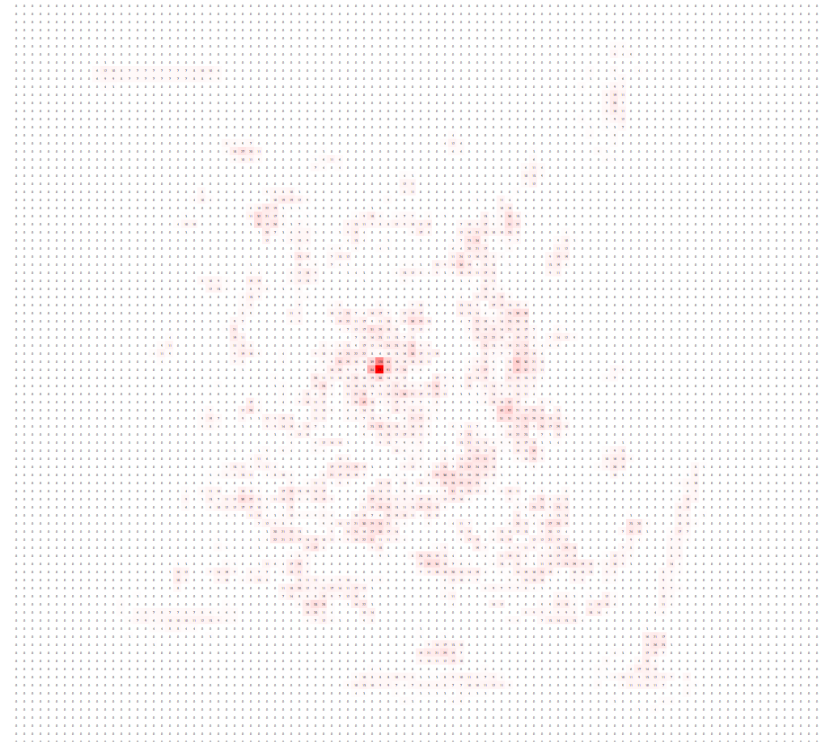
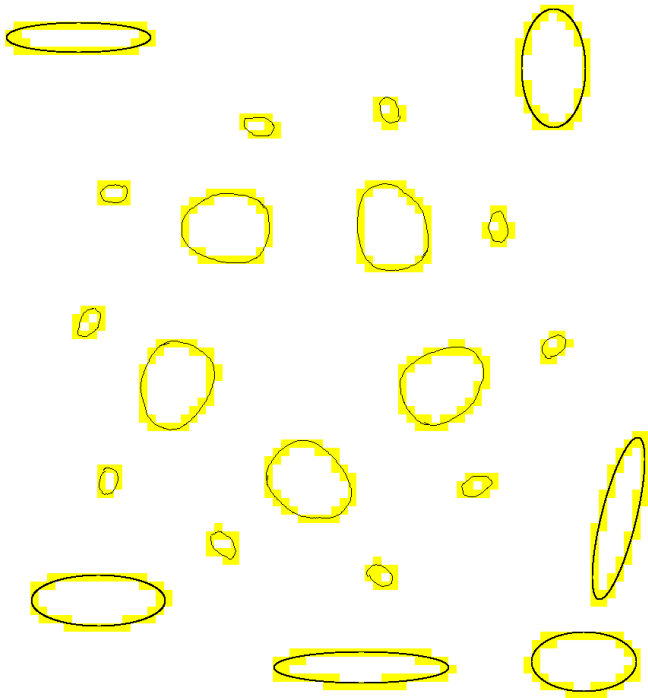
# Concept 2 (2D rotational): test 3

- ▶ 1st (rotation step 3), 5th (step 5) and 9th (step 11) strongest symmetries



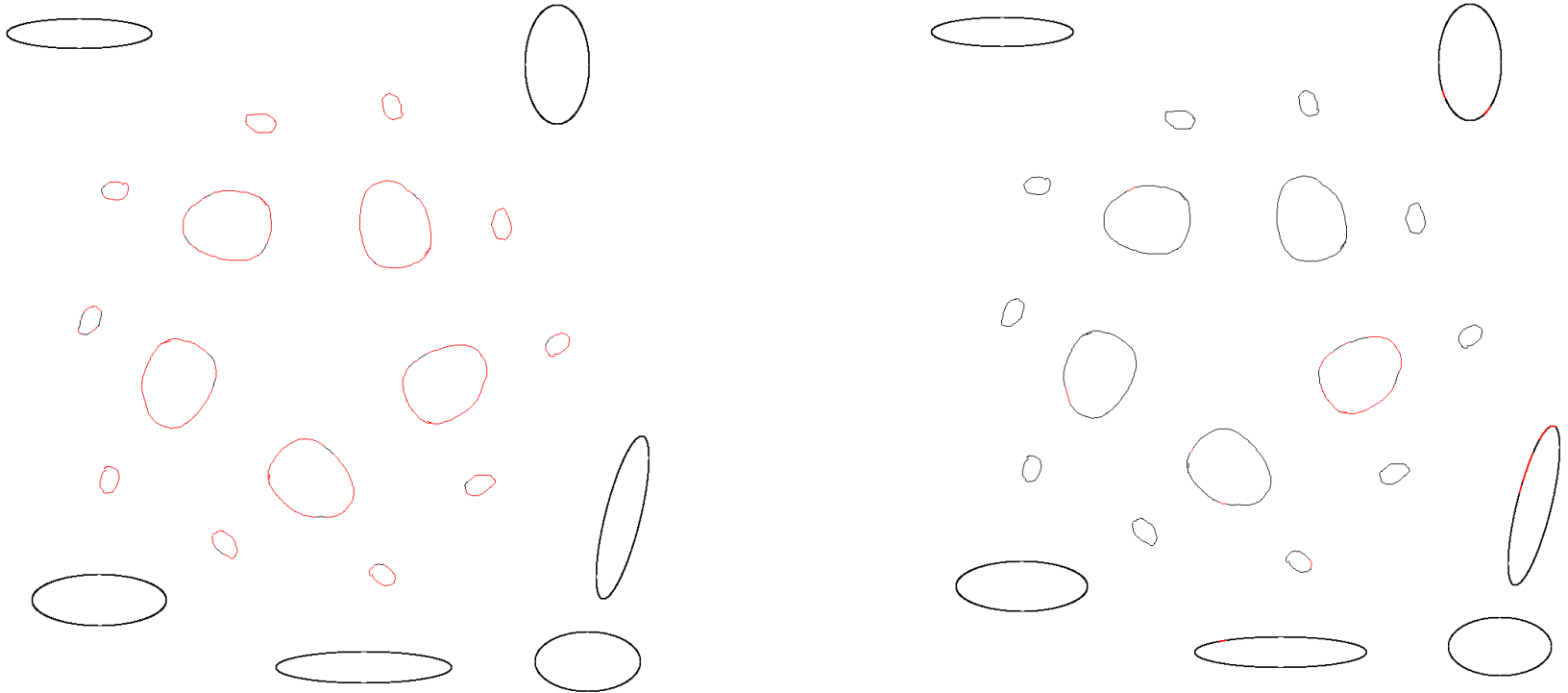
# Concept 2 (2D rotational): test 4

- ▶ Left: scene (black) and interesting voxels (yellow)
- ▶ Right: centres of detected symmetries (darker is stronger!!!!).



# Concept 2 (2D rotational): test 4

- ▶ 1st (step 5) and one of the irrelevant remaining symmetries.





# Future work

- ▶ Completion of Concept 2 tasks
- ▶ Implementation of the initial concept (based on line segments)
- ▶ Optimisation of both concepts (e.g. hierarchical voxelization)
- ▶ Multiple (shifted) voxelisations for 0.5 voxel size up, left, back. Additional challenge here is identification which symmetries from different voxelisations are actually the same.

# Thanks

- ▶ *to UM FERI students Matic Rašl and Luka Lukač for implementation, discussion, ideas...*
- ▶ *to you for surviving this presentation.*