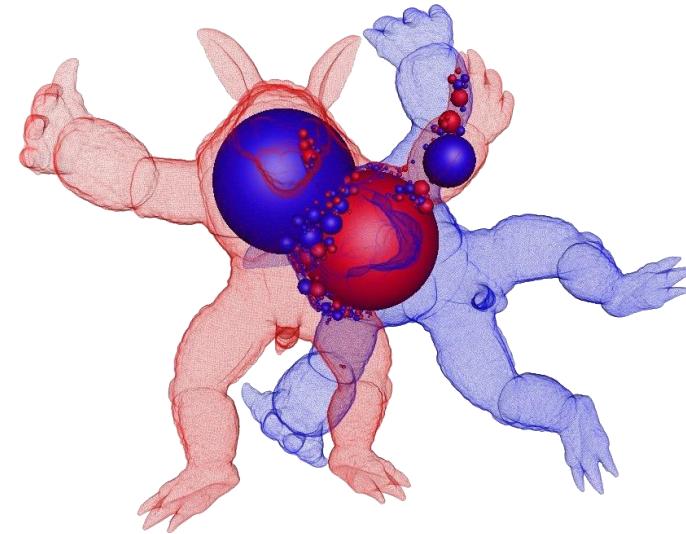


# Computational Geometry Of Collisions and Spheres

and their Application to Computer Graphics and Beyond





# Motivation



[Rise of the Tomb Raider]



[RTT Deltagen 12]



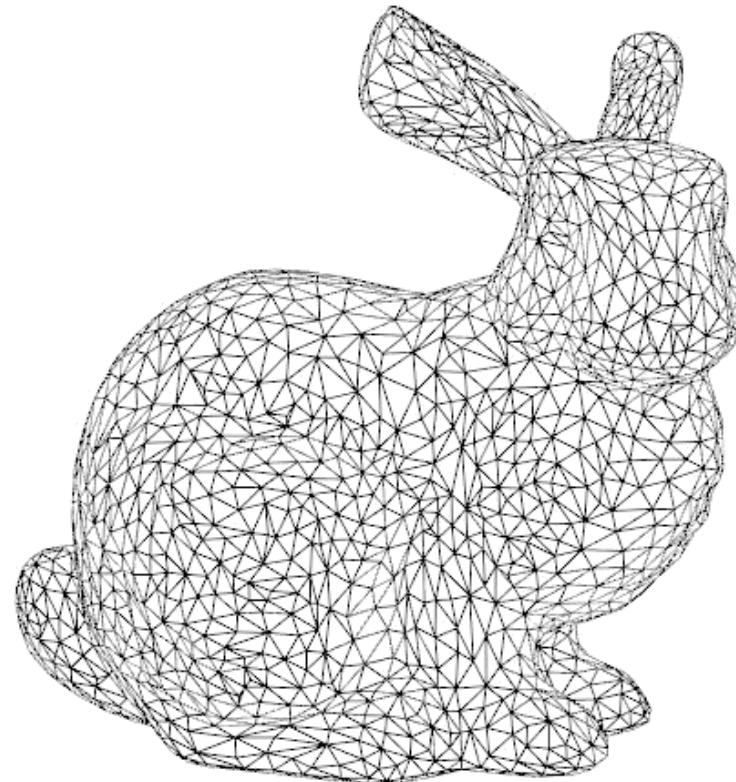
# Motivation



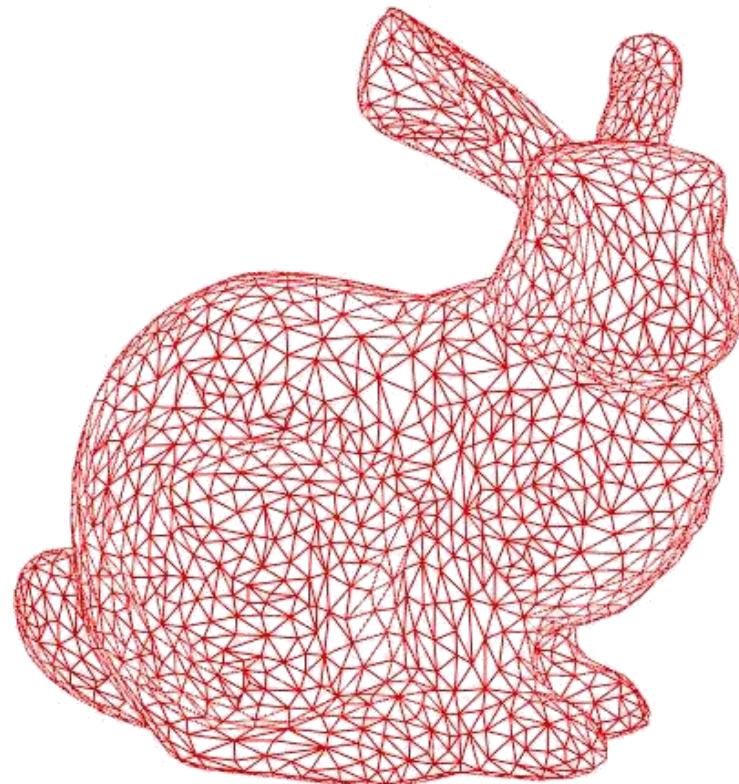
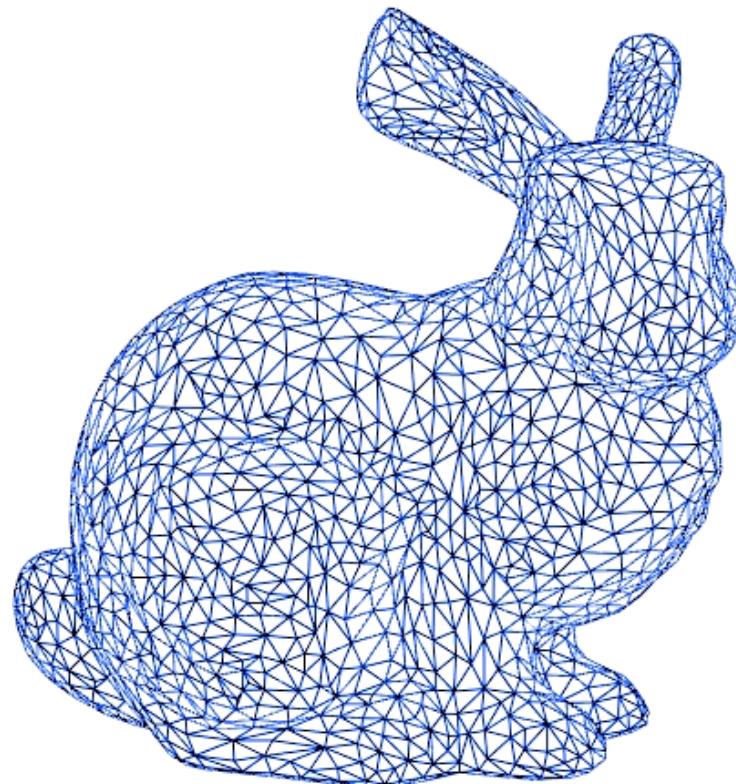
# Collision Detection Basics



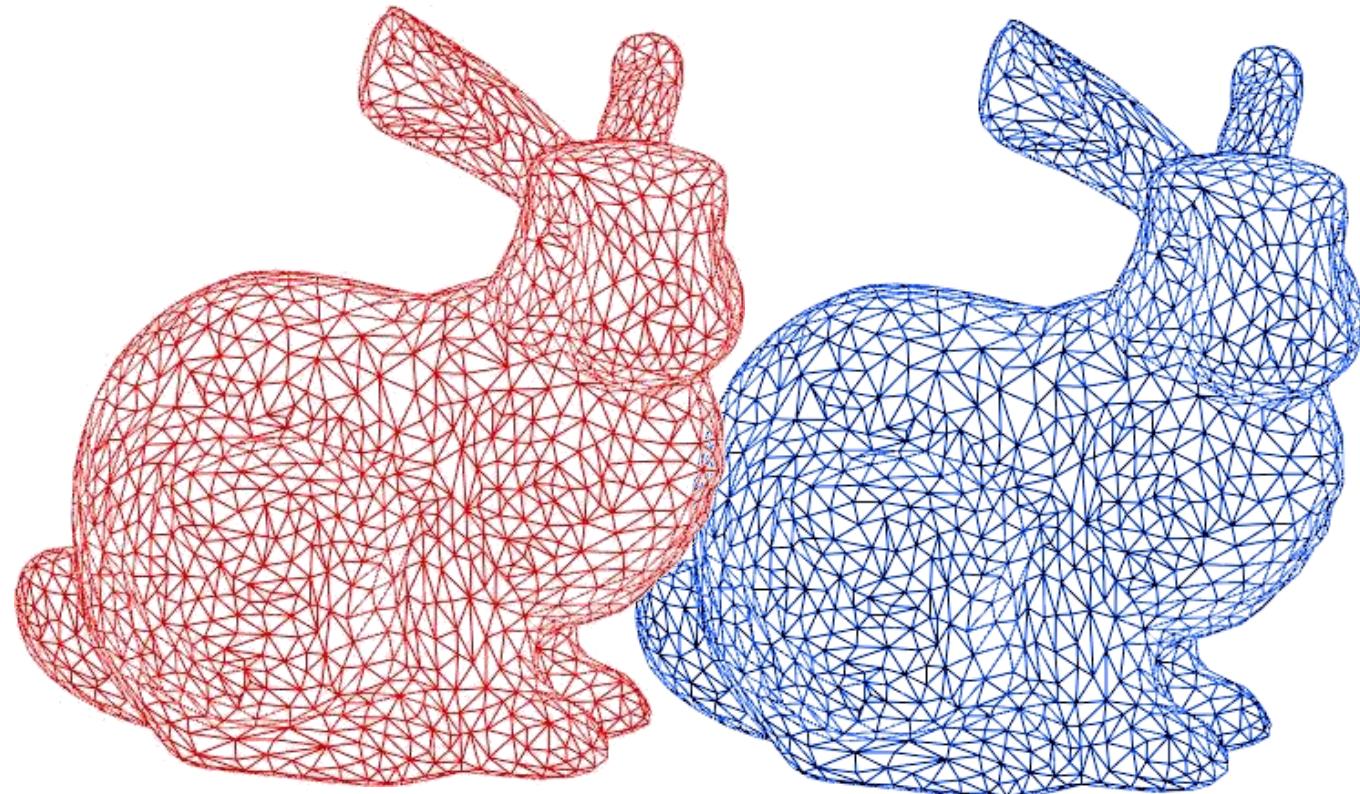
# Collision Detection Basics



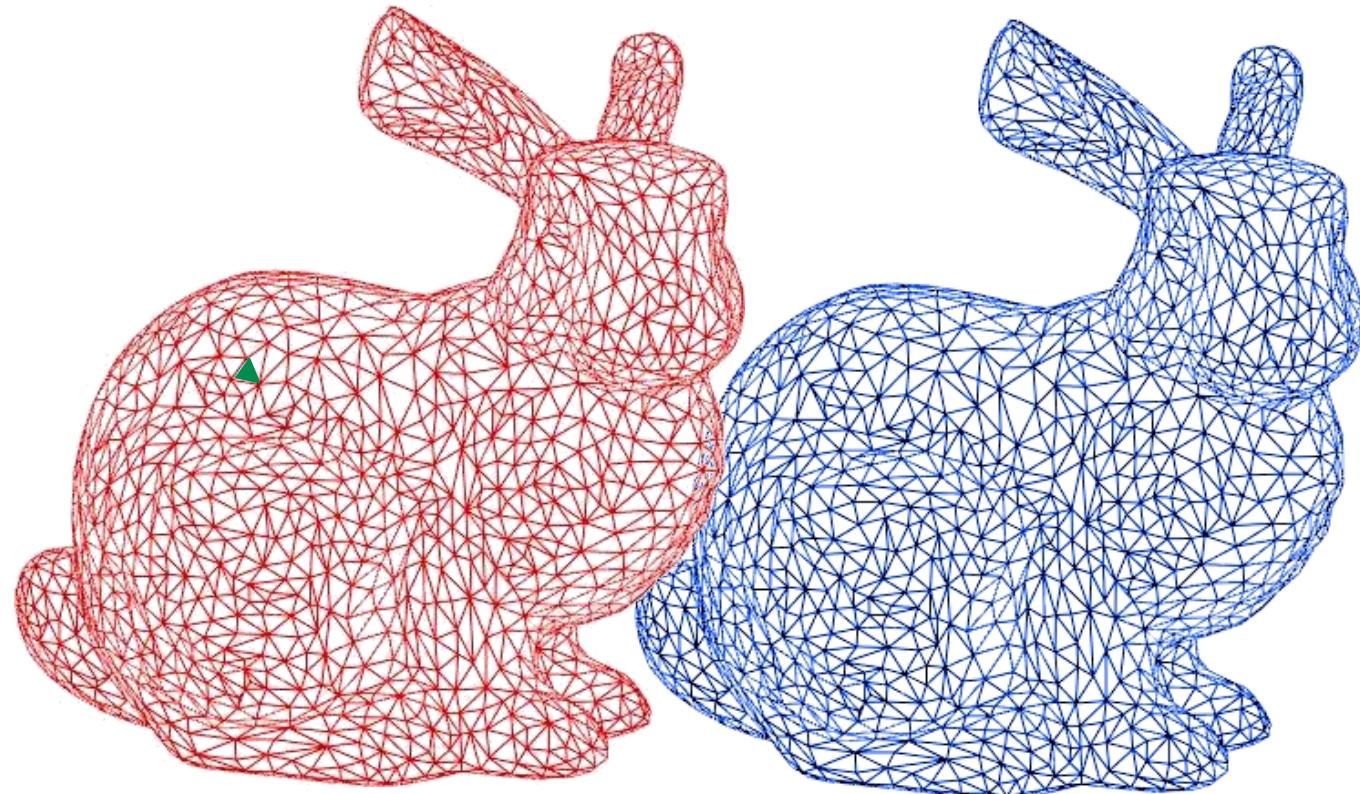
# Collision Detection Basics



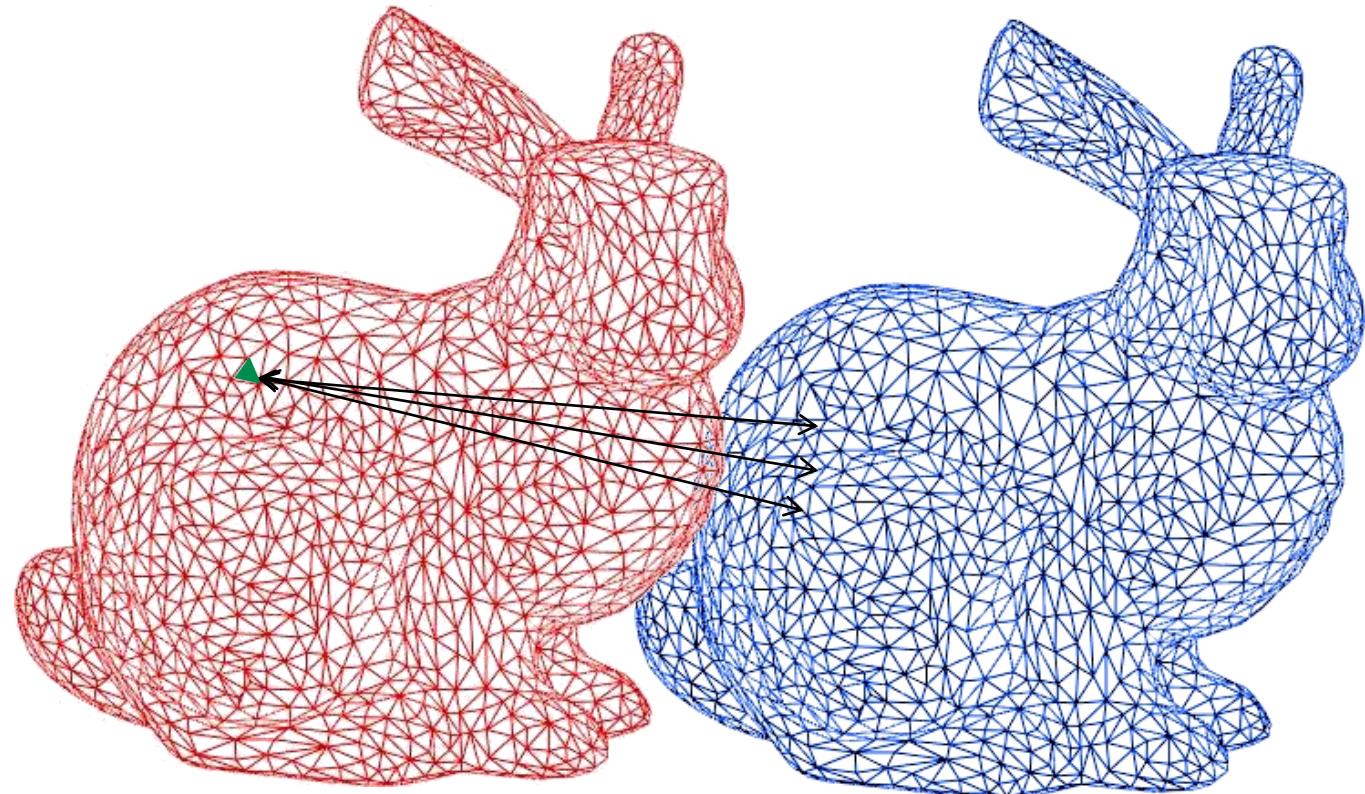
# Collision Detection Basics



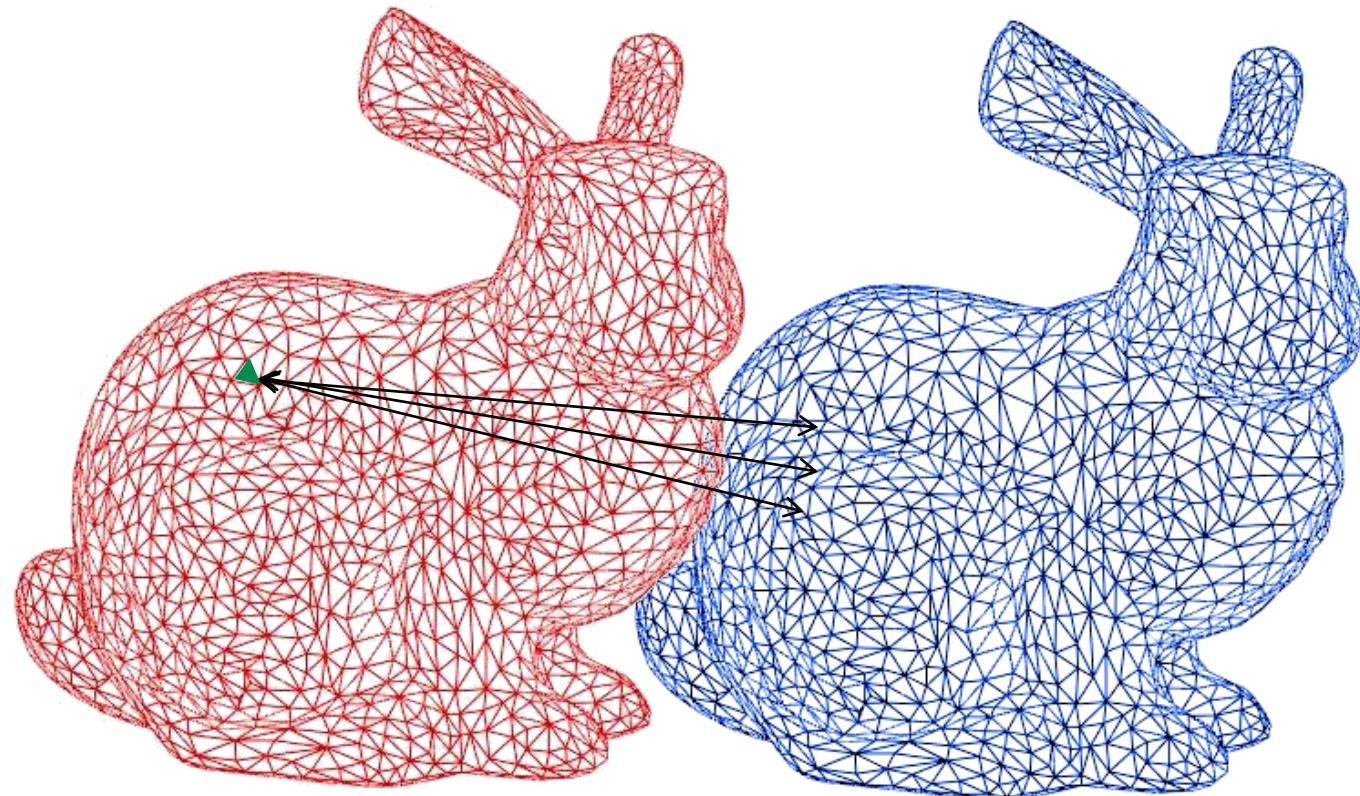
# Collision Detection Basics



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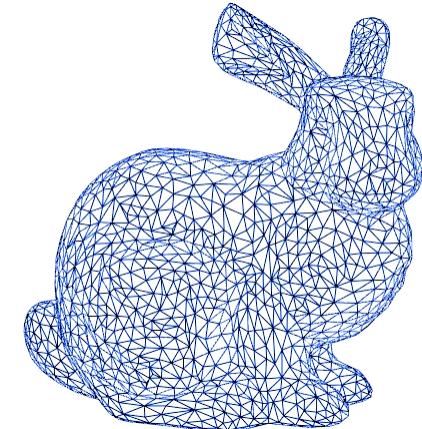


# Collision Detection Basics

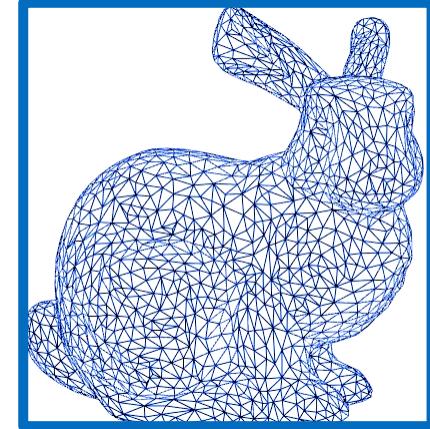


$$O(n^2)$$

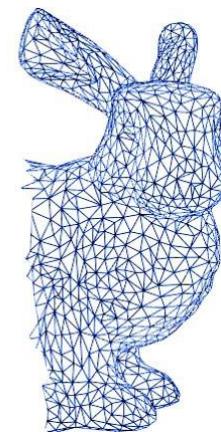
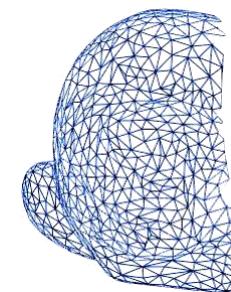
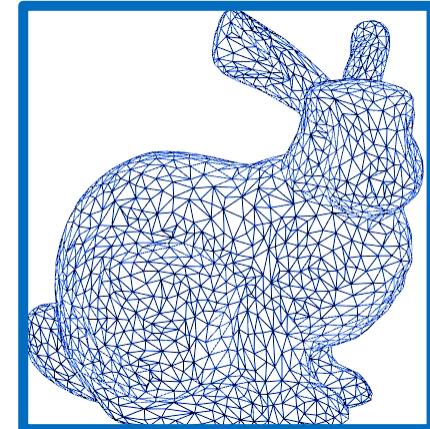
# Bounding Volume Hierarchies



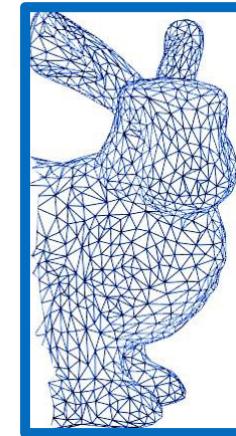
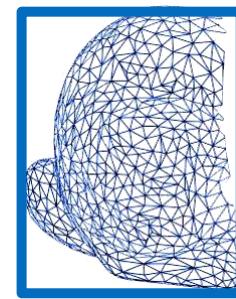
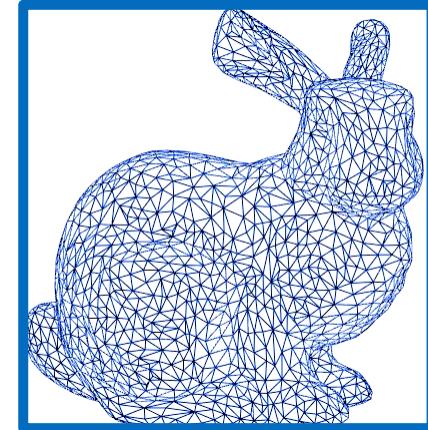
# Bounding Volume Hierarchies



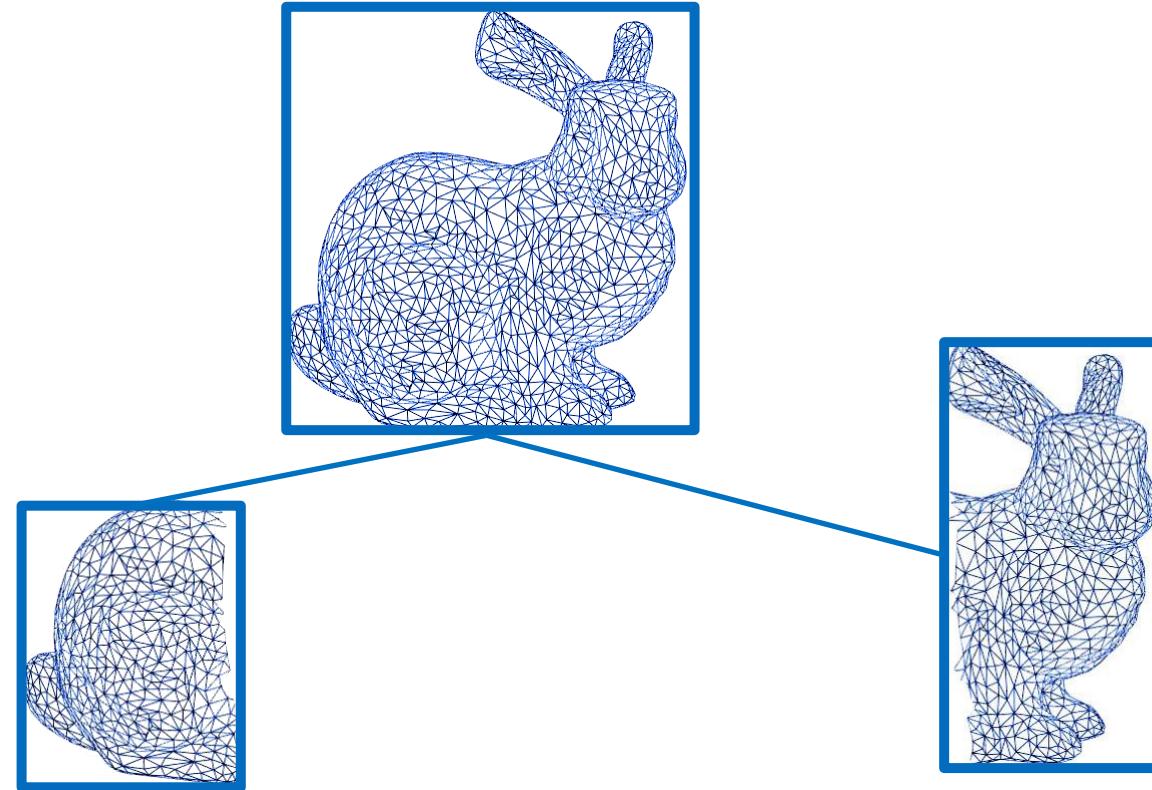
# Bounding Volume Hierarchies



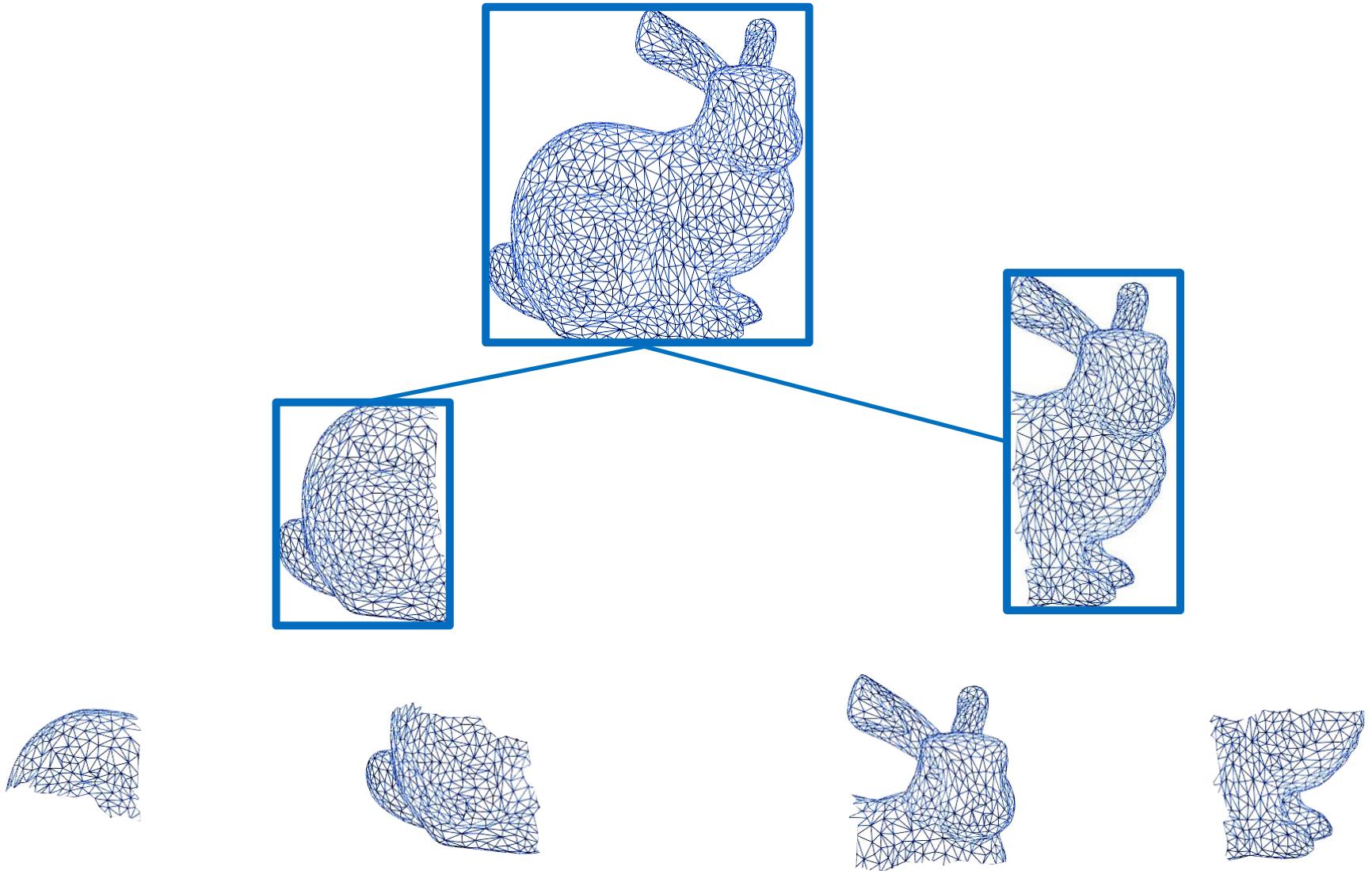
# Bounding Volume Hierarchies



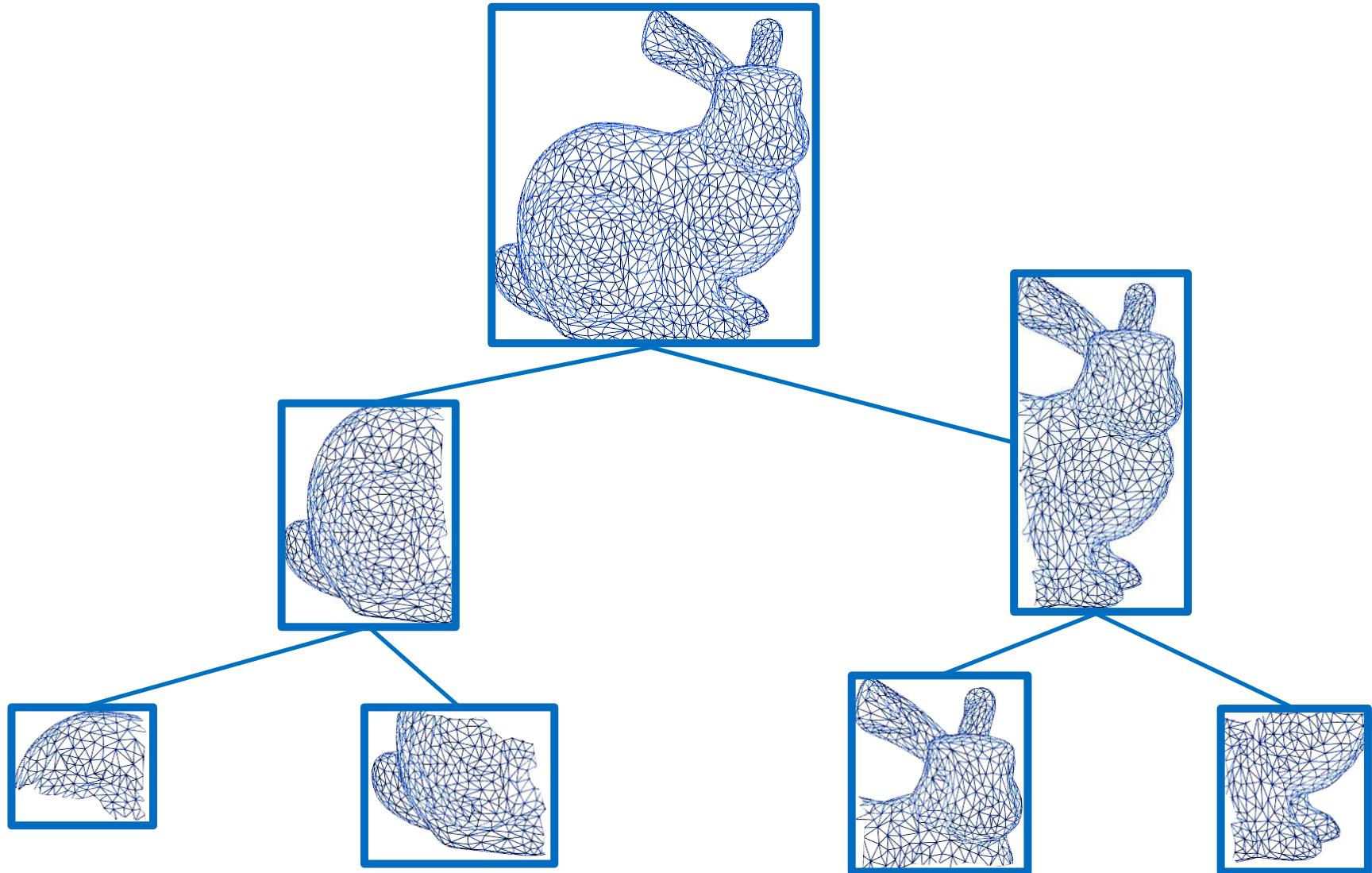
# Bounding Volume Hierarchies



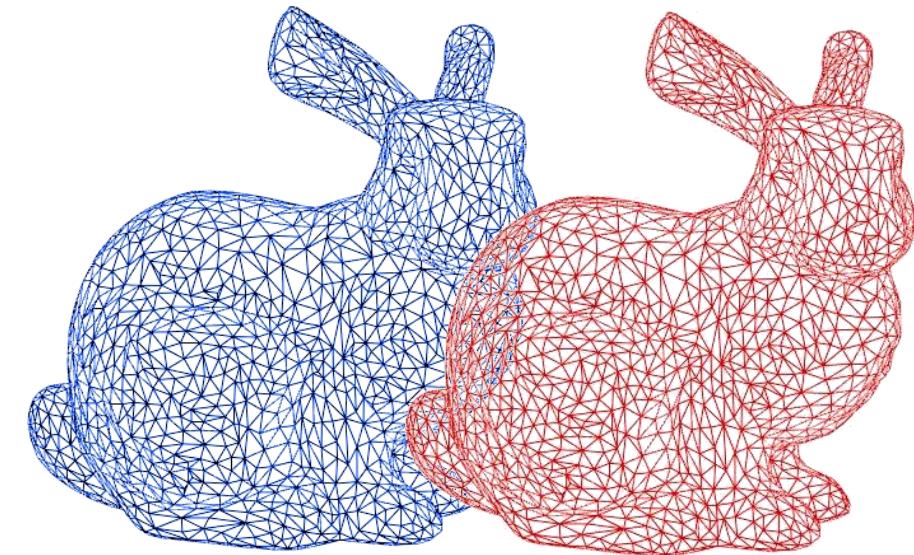
# Bounding Volume Hierarchies



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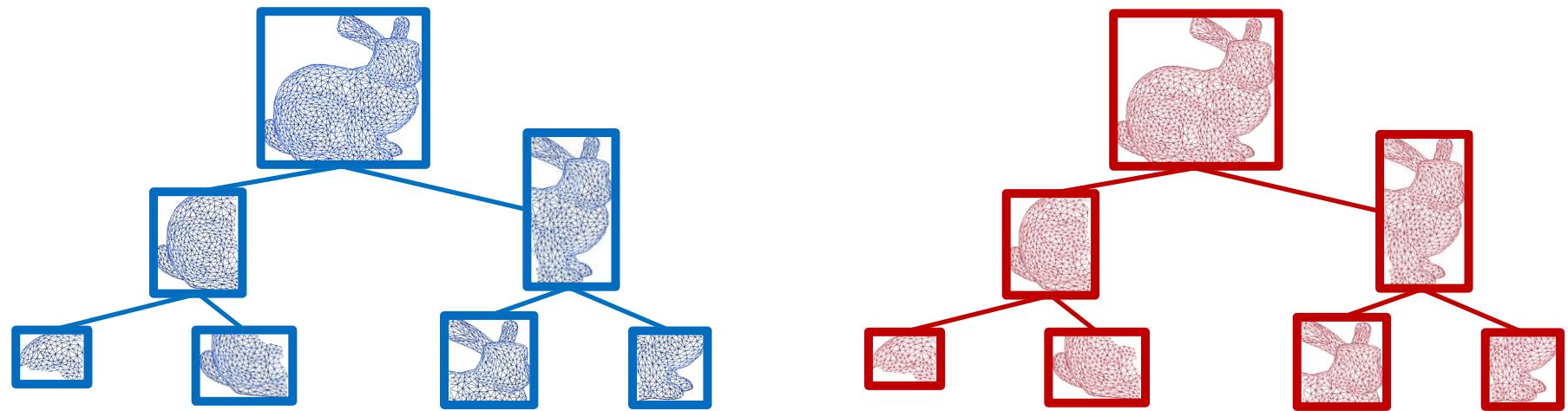
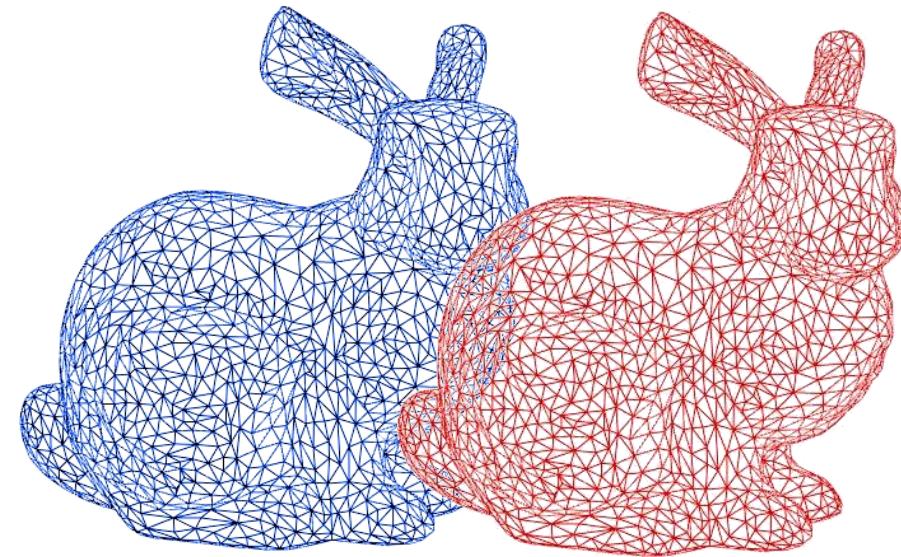


# BVH Traversal

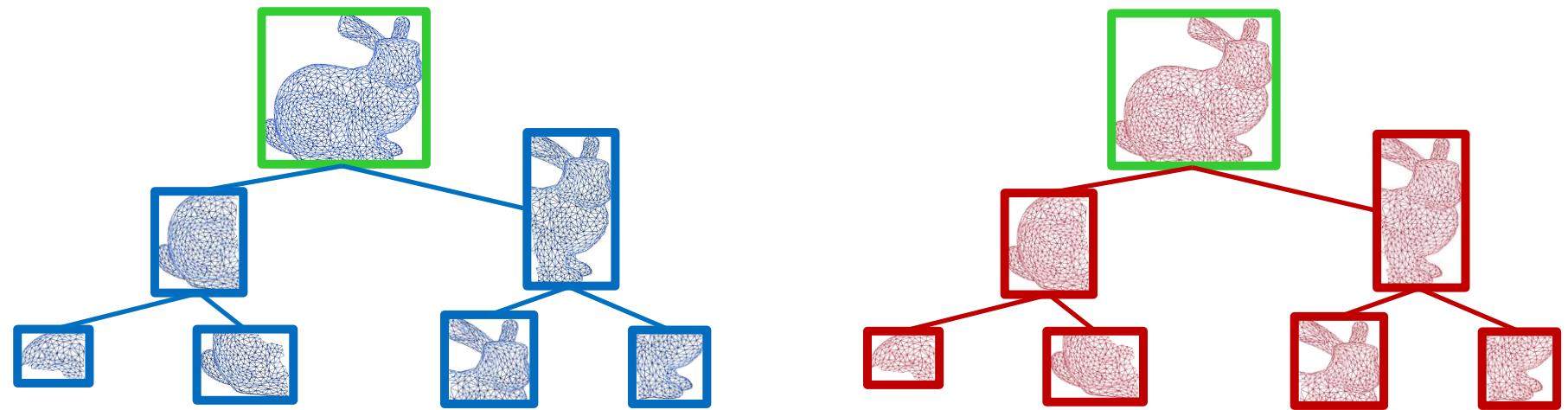
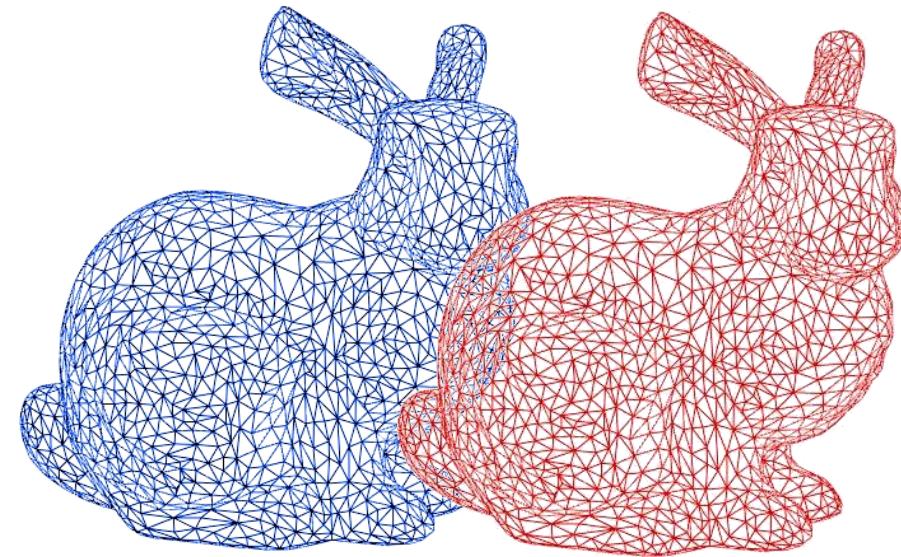




# BVH Traversal

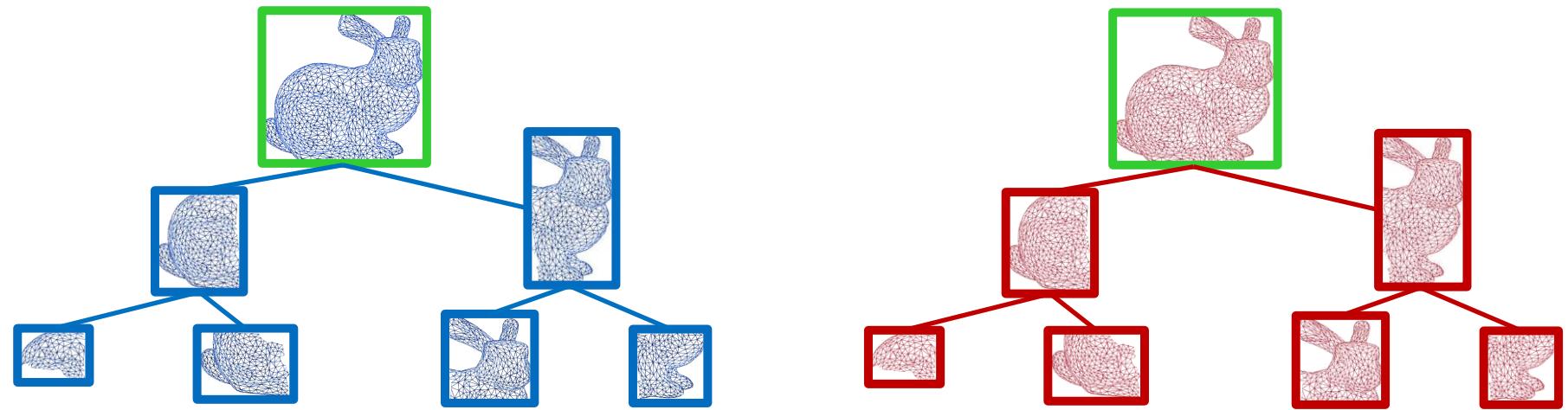
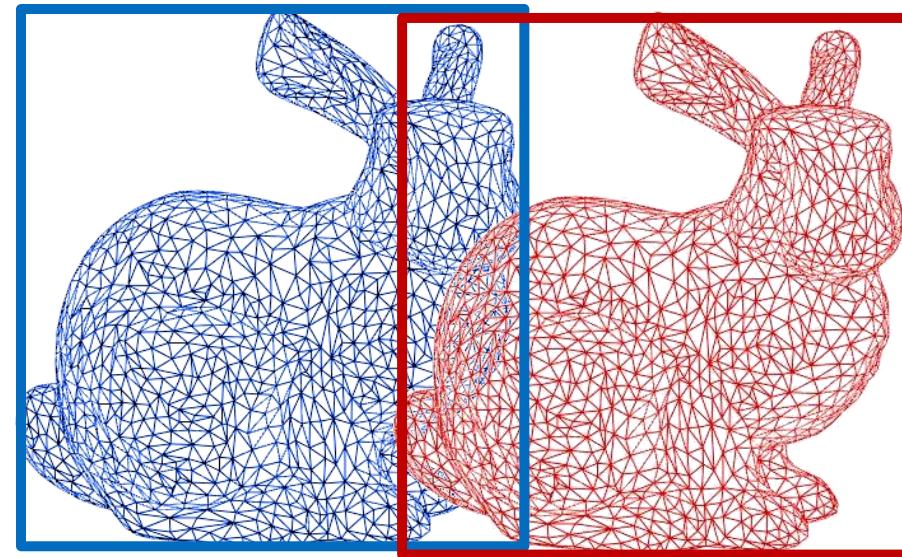


# BVH Traversal

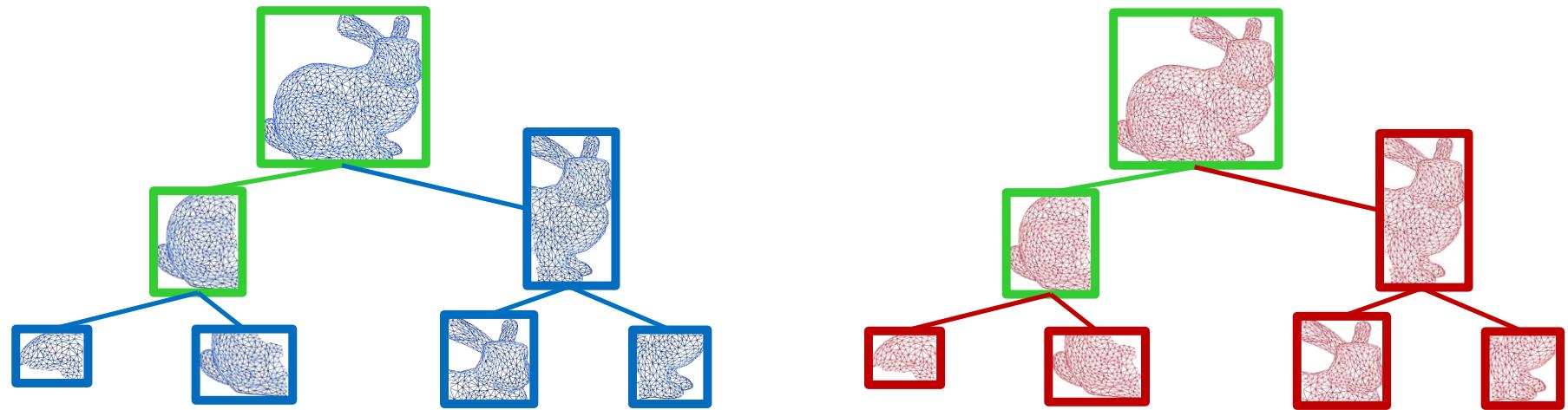
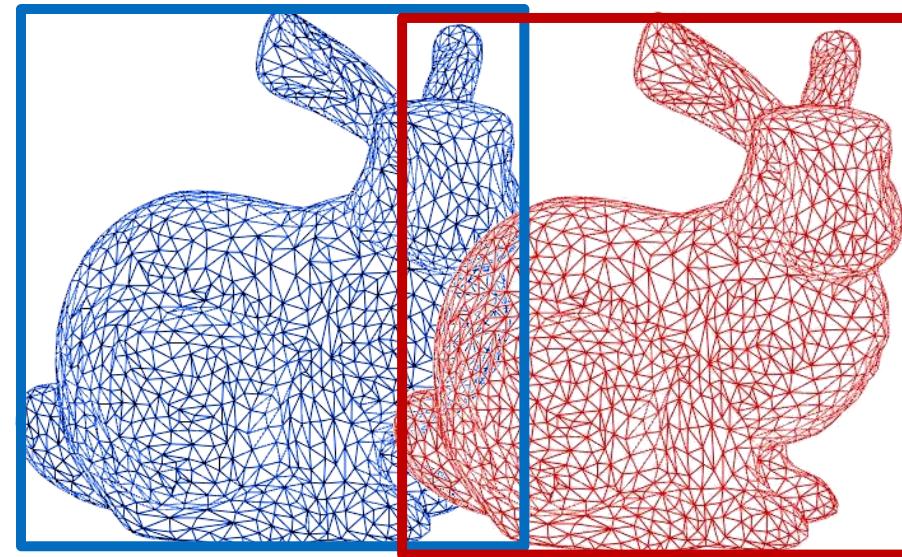




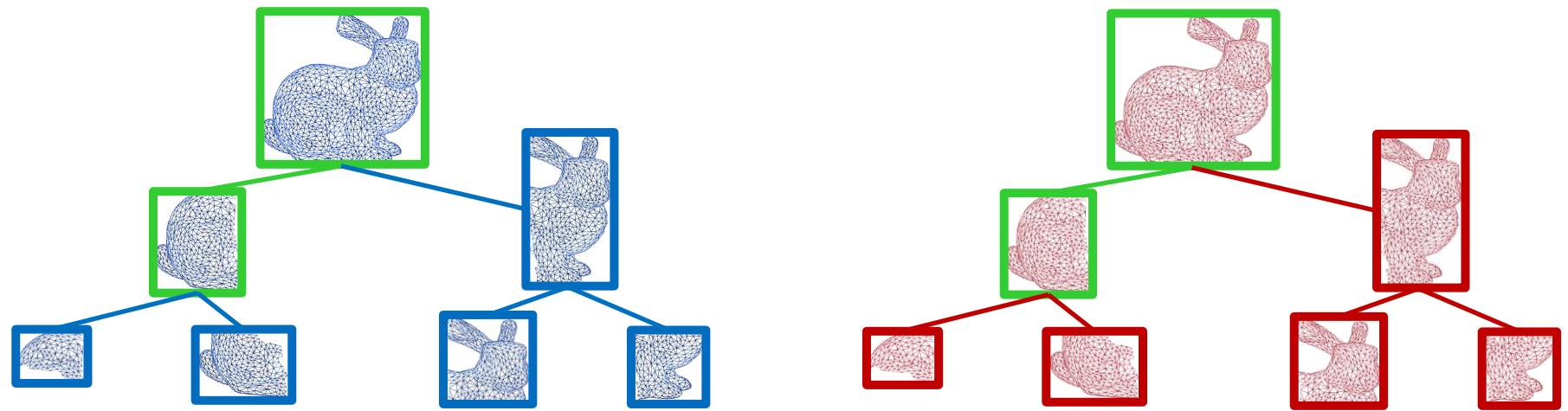
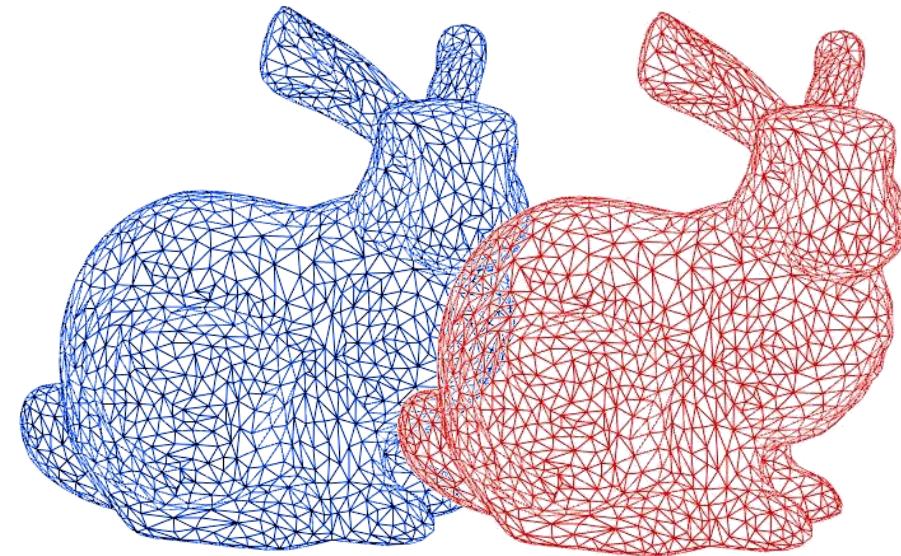
# BVH Traversal



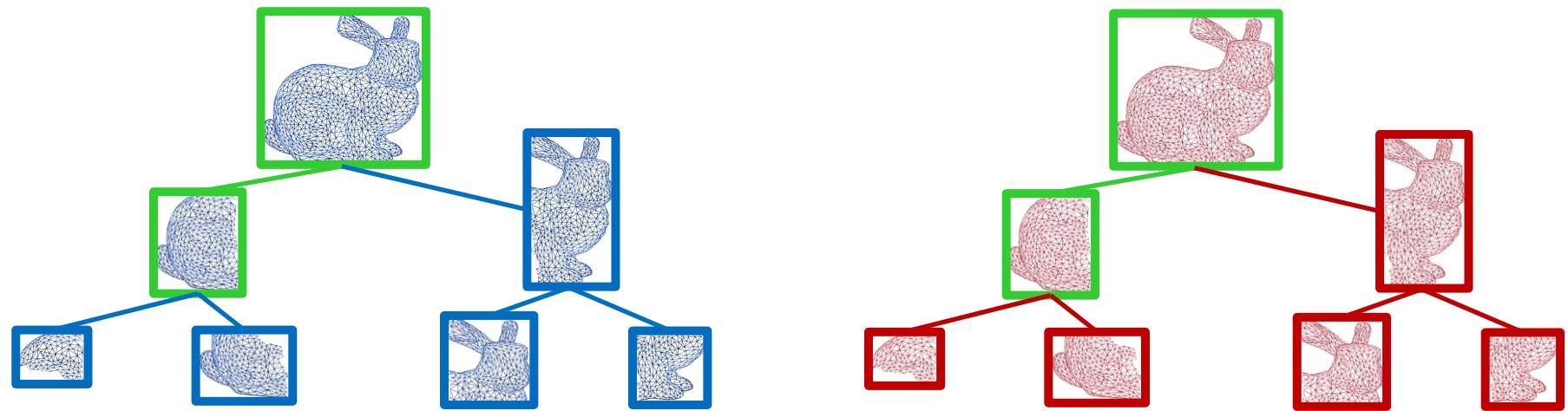
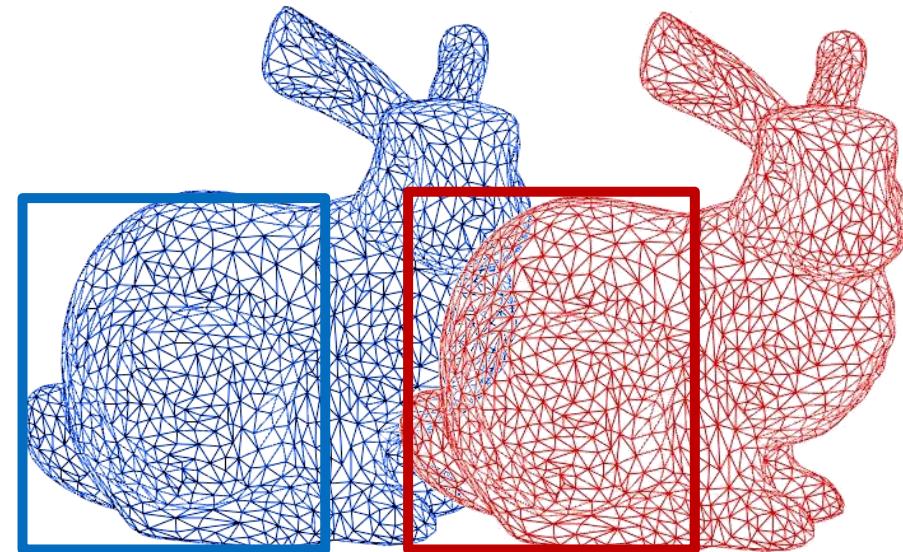
# BVH Traversal



# BVH Traversal



# BVH Traversal



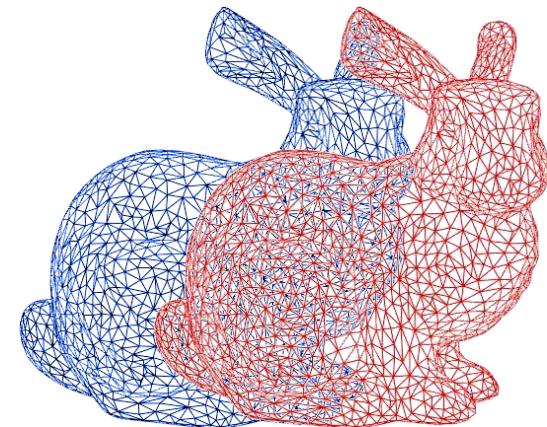
# Simultaneous Recursive BVH Traversal



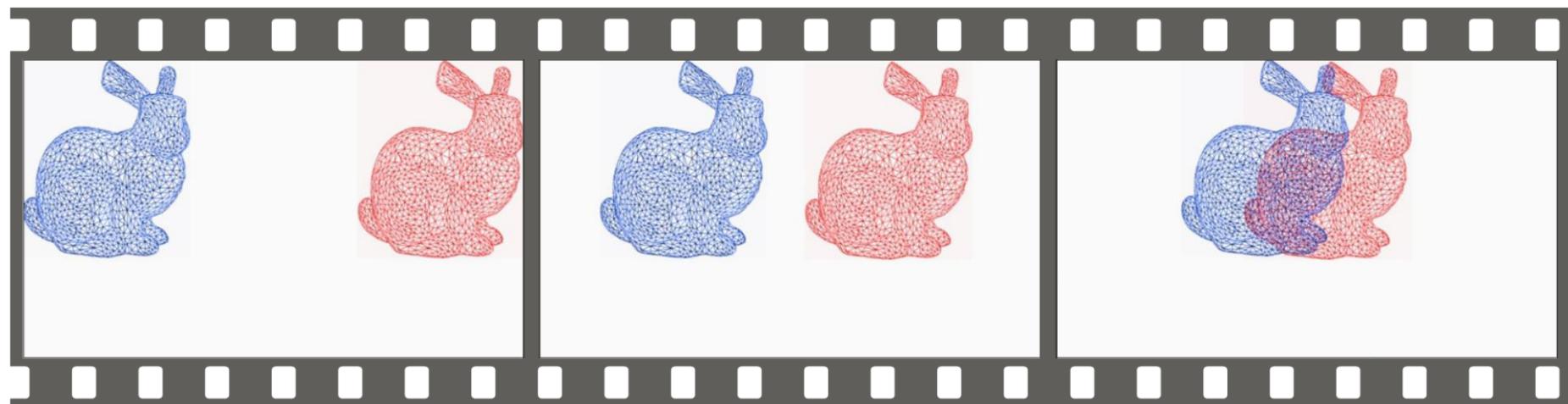
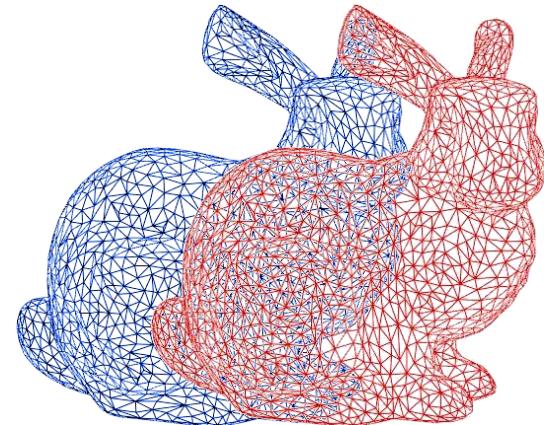
# Simultaneous Recursive BVH Traversal

```
bool checkCollision( BV A, BV B )
    if A and B are Leaves then
        return checkPolygons(Polygon of A, Polygon of B)
    else
        forall the Children Ai of A do
            forall the Children Bi of B do
                if( overlap (Ai , Bi) )
                    return checkCollision(Ai , Bi)
        return false
```

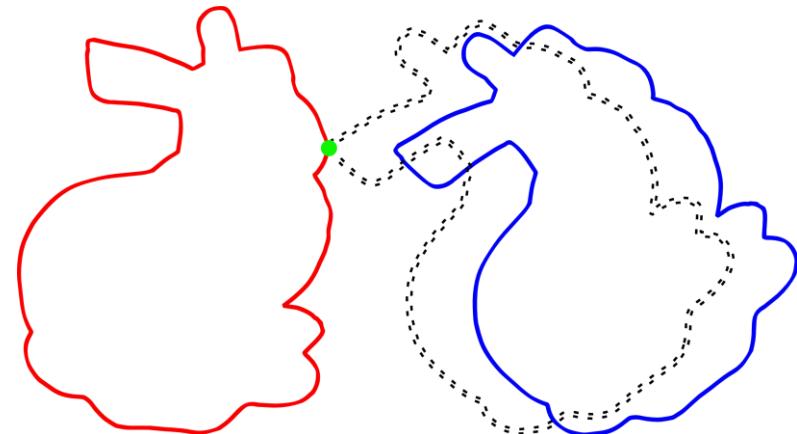
# Discrete Collision Detection



# Discrete Collision Detection

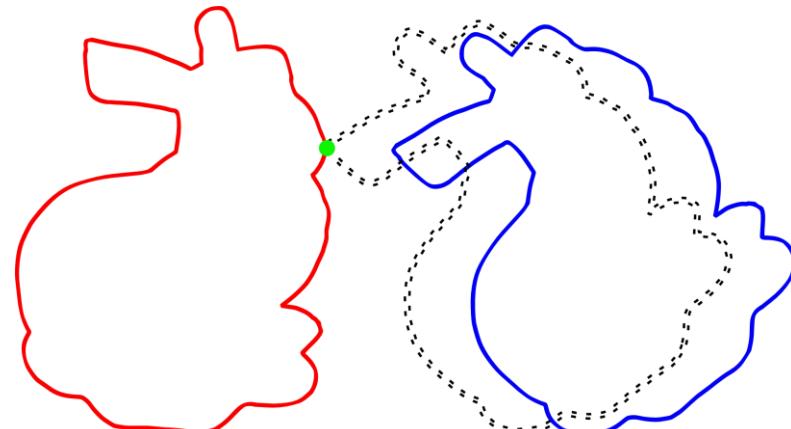


# Penetration Measures

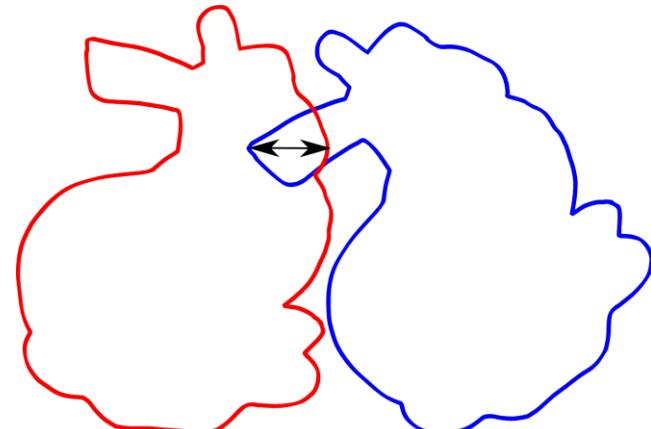


Continuous collision detection

# Penetration Measures

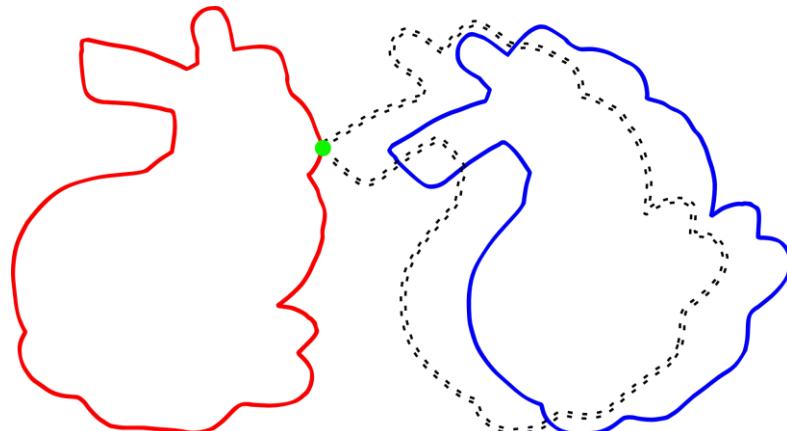


Continuous collision detection

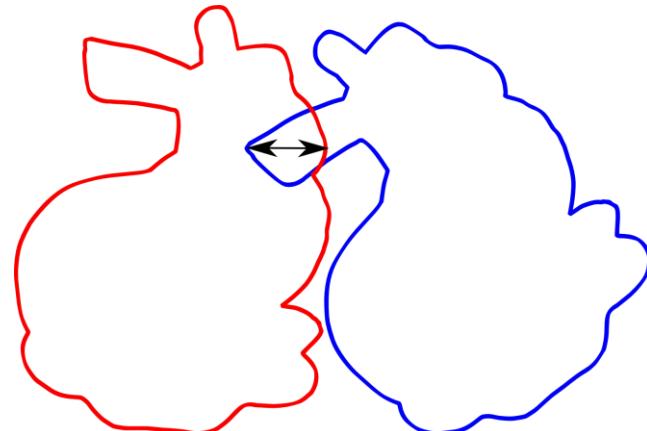


Translational penetration depth

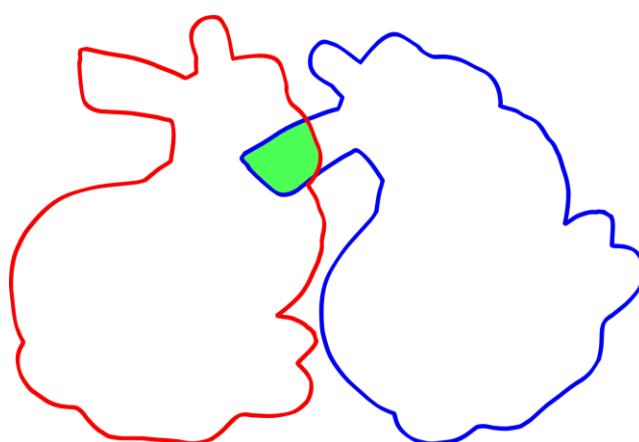
# Penetration Measures



Continuous collision detection

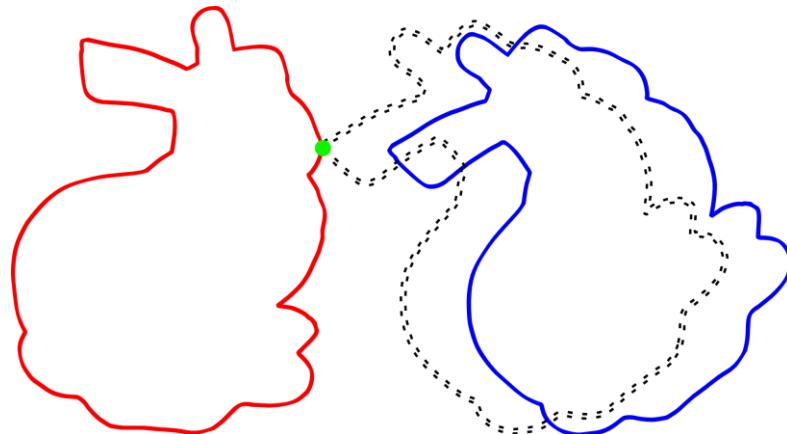


Translational penetration depth

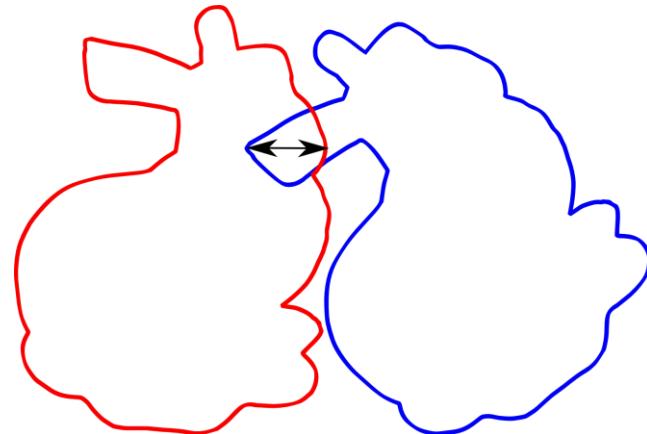


Penetration volume - “the most complicated yet accurate method” [Fisher and Lin, 2001]

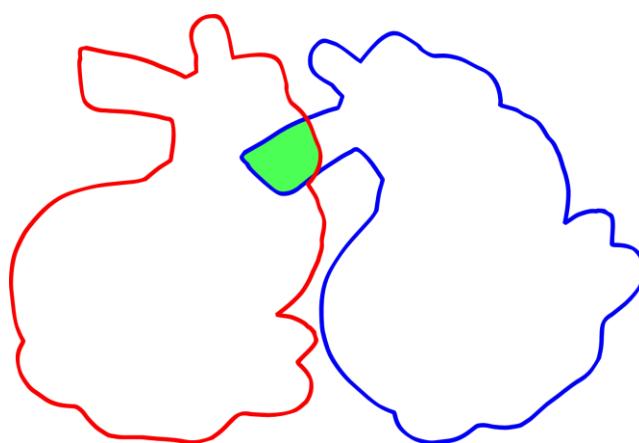
# Penetration Measures



Continuous collision detection



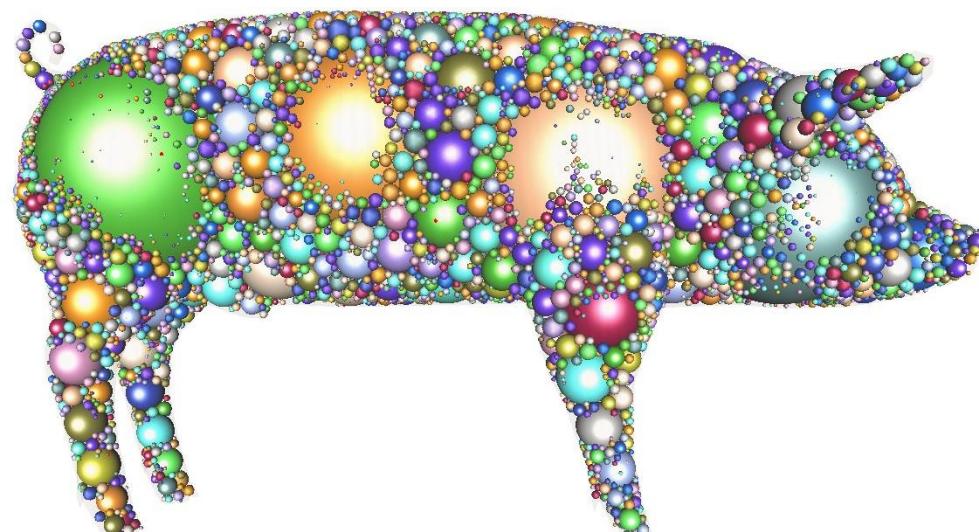
Translational penetration depth



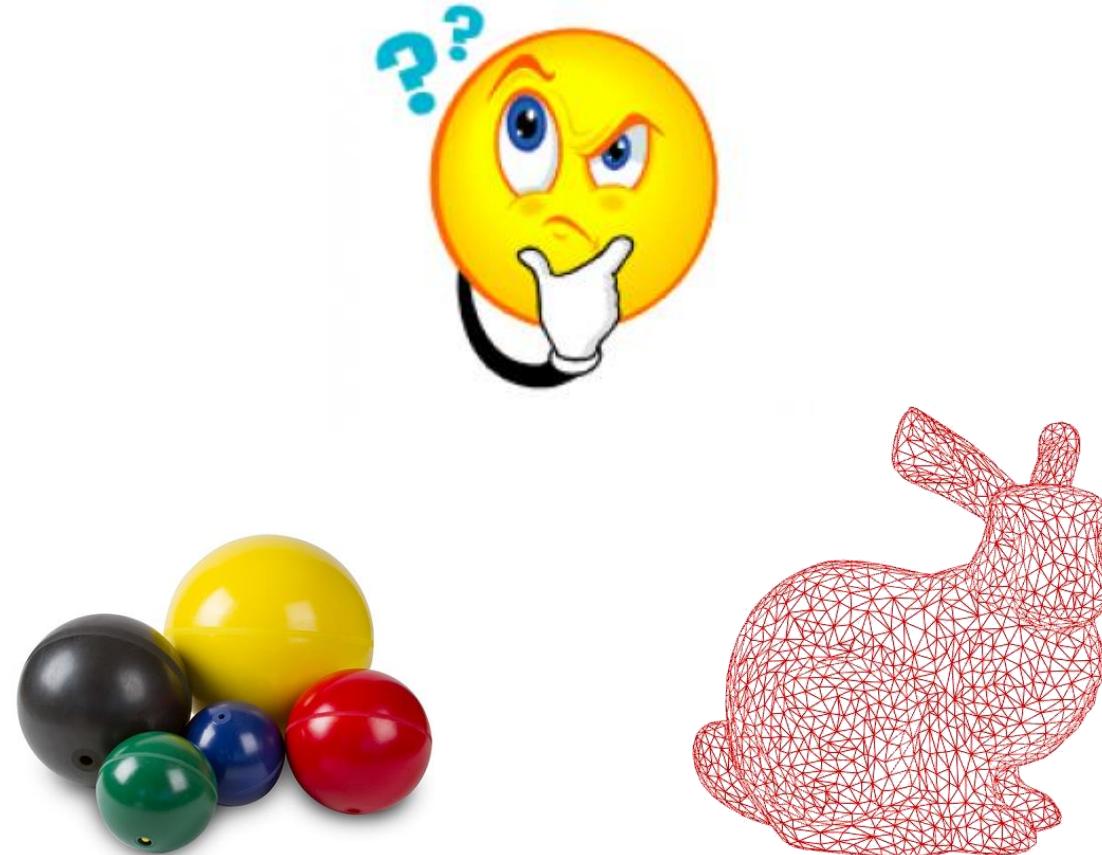
Penetration volume - “the most complicated yet accurate method” [Fisher and Lin, 2001]



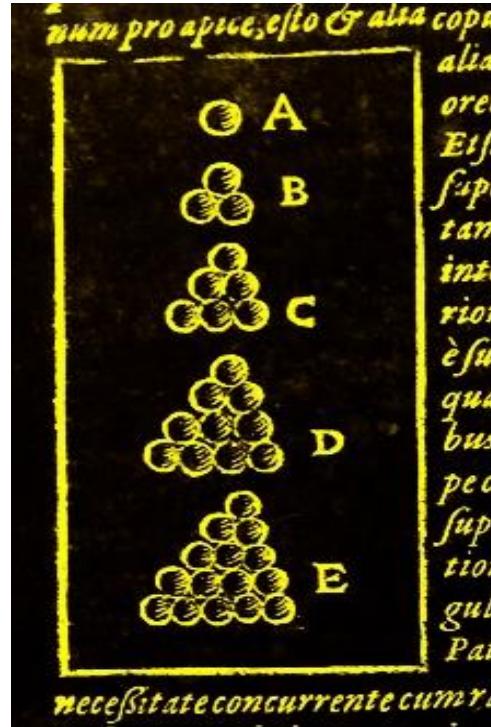
- Fill the object
  - from the *inside*
  - with *non-overlapping* spheres
- Build sphere hierarchy on *inner* spheres



# How to get the Spheres into the Object?

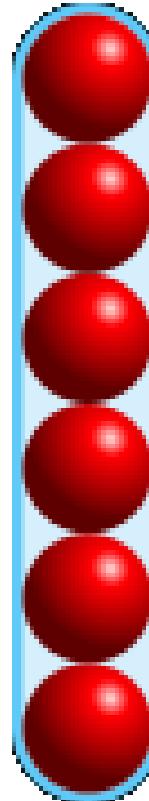


# A brief History of Sphere Packings

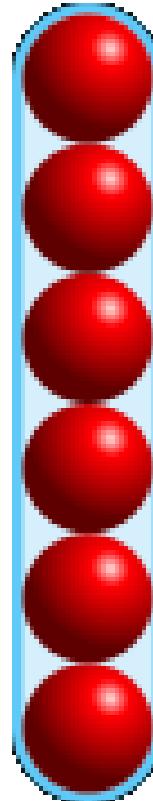


Johannes Kepler (1571 – 1630)

# Excuse: The Sausage Conjecture

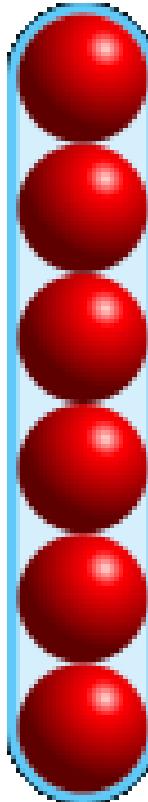


# Excuse: The Sausage Conjecture

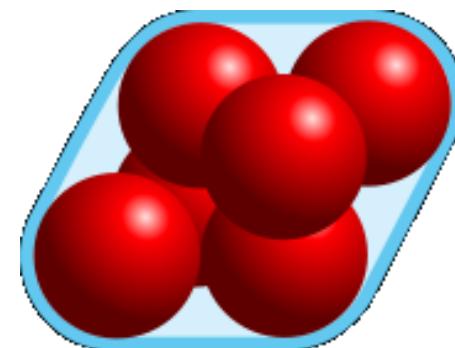


Sausage

# Excuse: The Sausage Conjecture

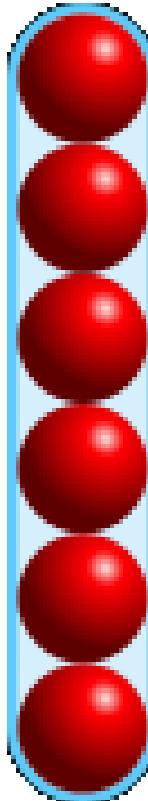


Sausage

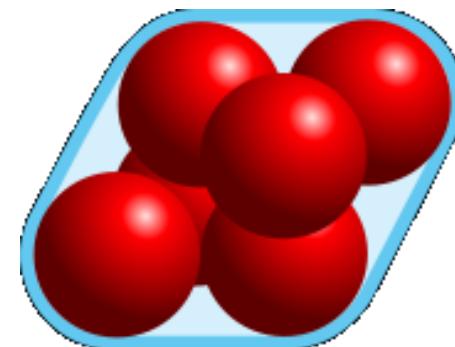


Cluster

# Excuse: The Sausage Conjecture



Sausage

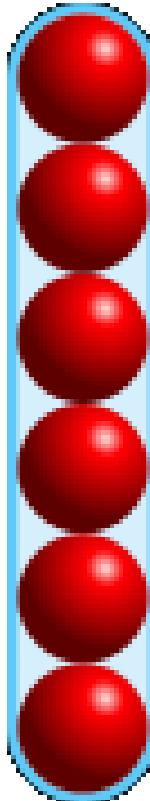


Cluster

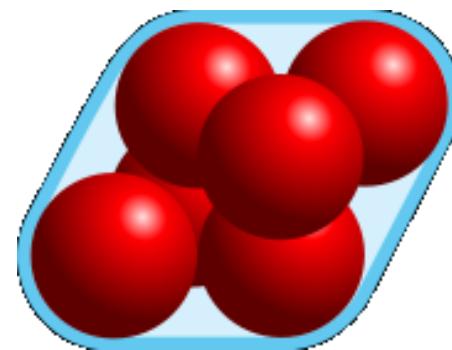


:optimal for n=3 and 4

# Excuse: The Sausage Conjecture



Sausage



Cluster

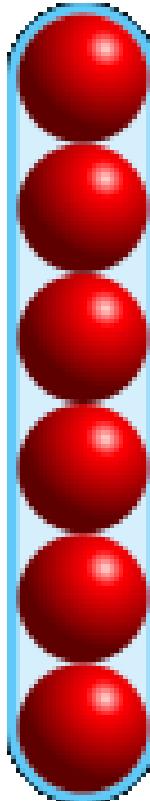


:optimal for  $n=3$  and  $4$

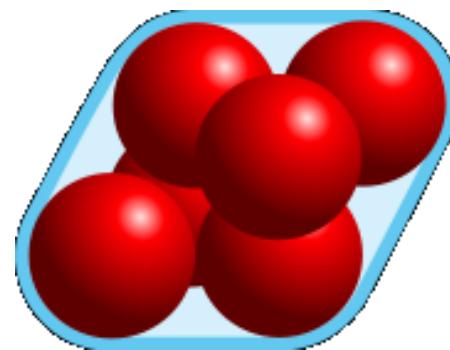


:optimal for  $n < 56$ ?

# Excuse: The Sausage Conjecture



Sausage



Cluster



:optimal for  $n=3$  and  $4$

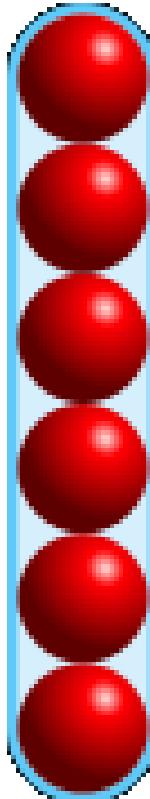


:optimal for  $n < 56$ ?

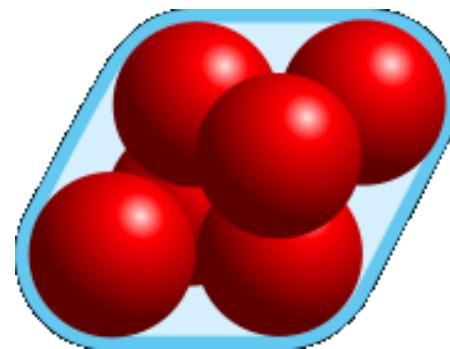


optimal for  $n=56, 59,$   
 $60, 61, 62, 65$

# Excuse: The Sausage Conjecture



Sausage



Cluster



:optimal for  $n=3$  and  $4$



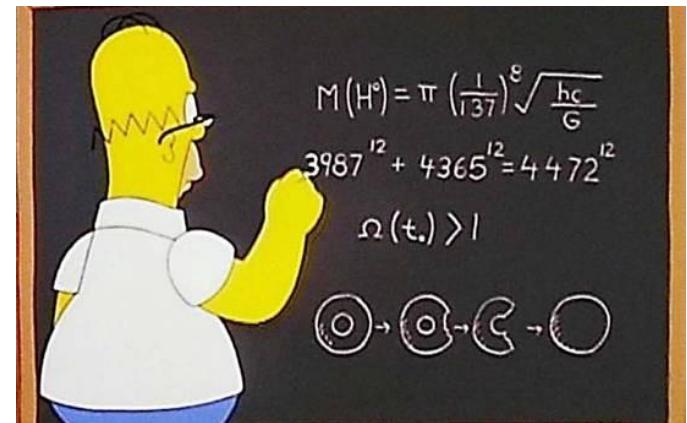
:optimal for  $n < 56$ ?



optimal for  $n=56, 59,$   
 $60, 61, 62, 65$

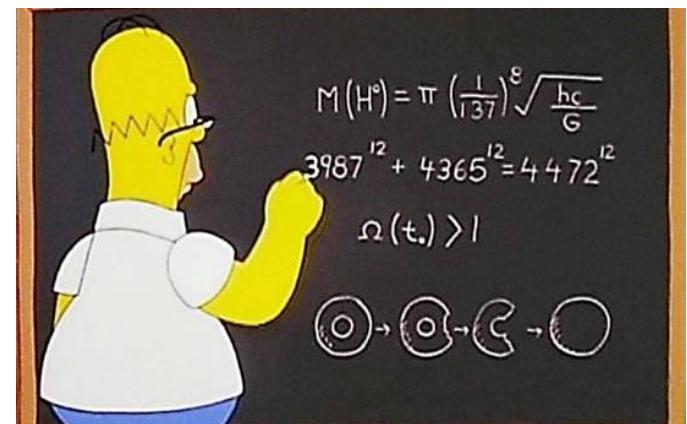
Nobody knows how they  
look

# More Sausage Catastrophes



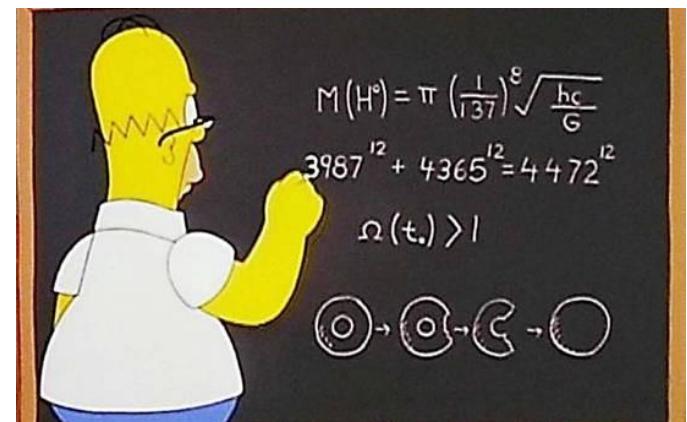
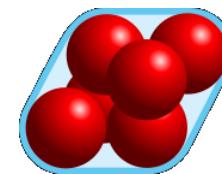
# More Sausage Catastrophes

- For dimension d=4: cluster becomes optimal for n>375370?



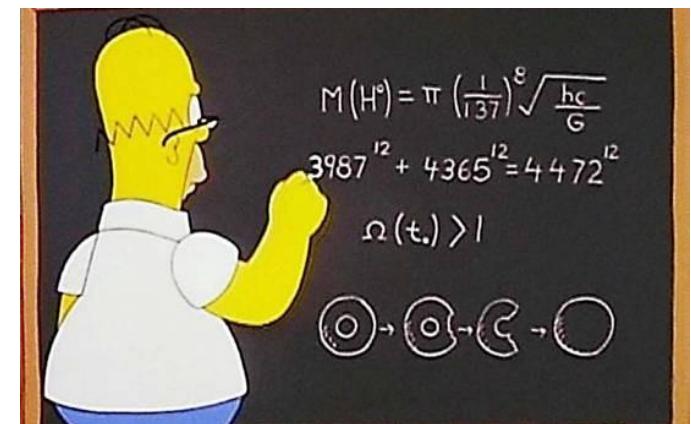
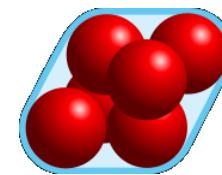
# More Sausage Catastrophes

- For dimension d=4: cluster becomes optimal for n>375370?



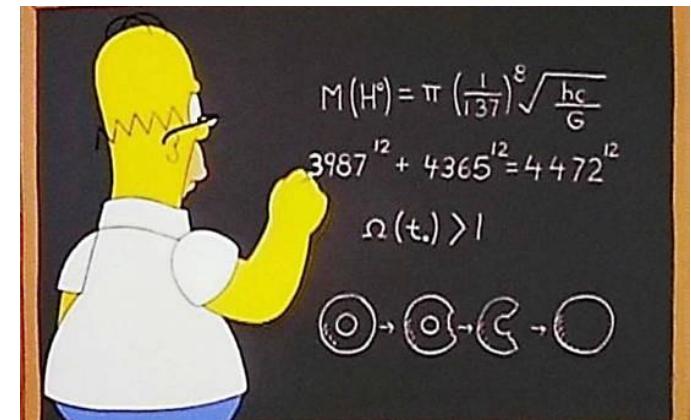
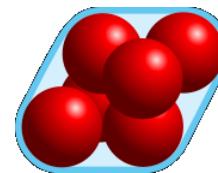
# More Sausage Catastrophes

- For dimension d=4: cluster becomes optimal for n>375370?
- For d<11 the optimum packing is always a cluster or a sausage, but never a pizza!

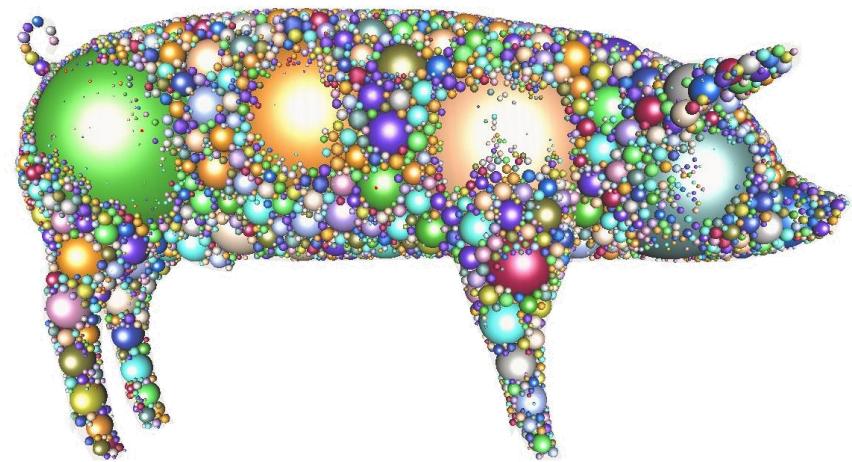


# More Sausage Catastrophes

- For dimension d=4: cluster becomes optimal for n>375370?
- For d<11 the optimum packing is always a cluster or a sausage, but never a pizza!
  - Note, this is not true for other convex shapes
  - E.g. it is possible to find for each d>2 a convex shape where the pizza is the closest packaging

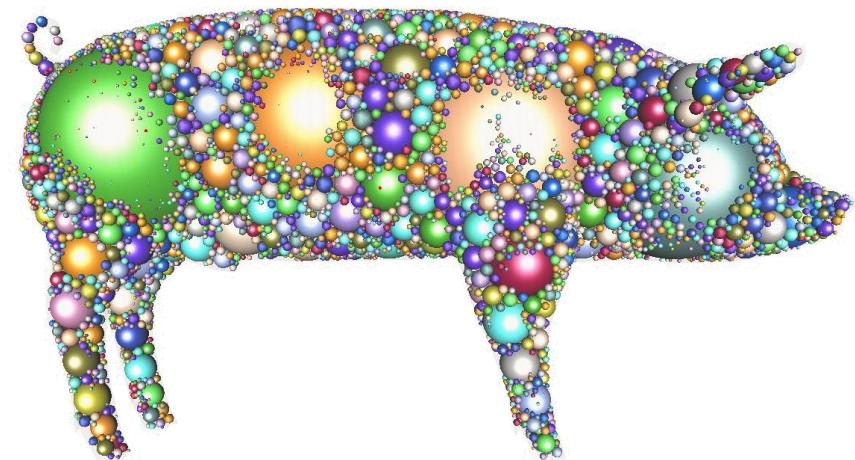


# Our Goal



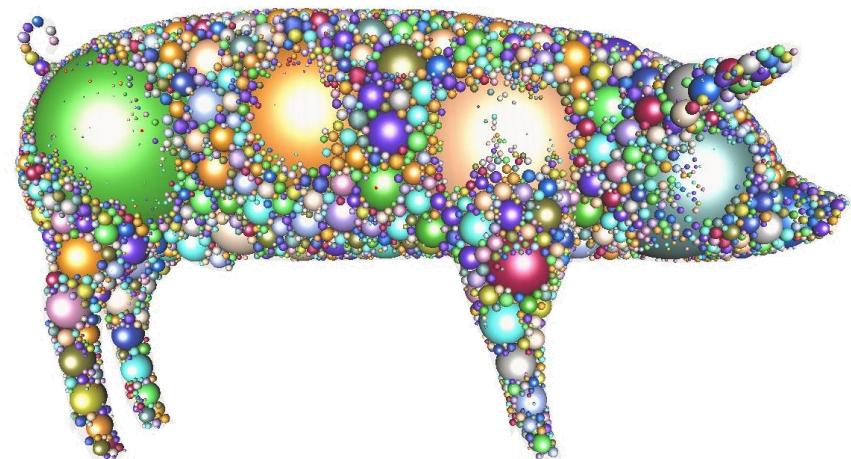
# Our Goal

- **Feasible Sphere Packing**
  - All spheres are **inside**
  - Spheres do **not overlap**



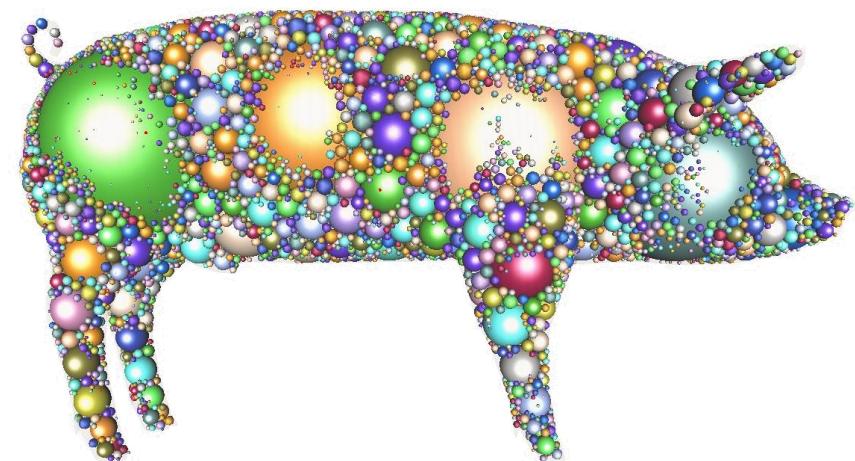
# Our Goal

- **Feasible Sphere Packing**
  - All spheres are **inside**
  - Spheres do **not overlap**
- Polydisperse packing
  - Space filling

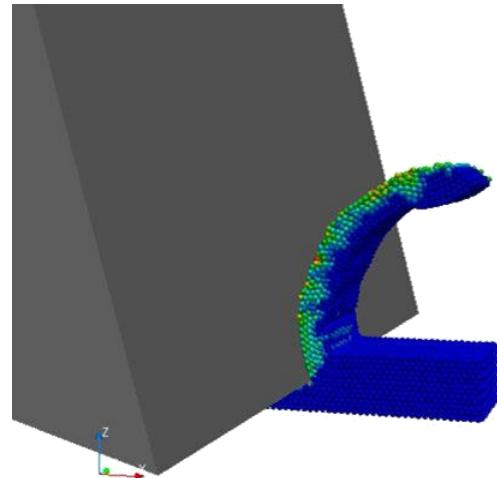


# Our Goal

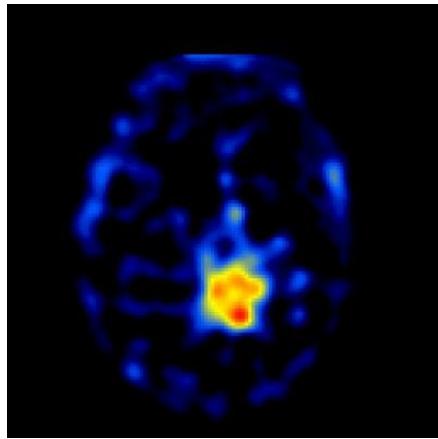
- **Feasible** Sphere Packing
  - All spheres are **inside**
  - Spheres do **not overlap**
- Polydisperse packing
  - Space filling
- Arbitrary objects
  - Arbitrary object representations  
(Polygonal, NURBS, CSG,  
point clouds,...)



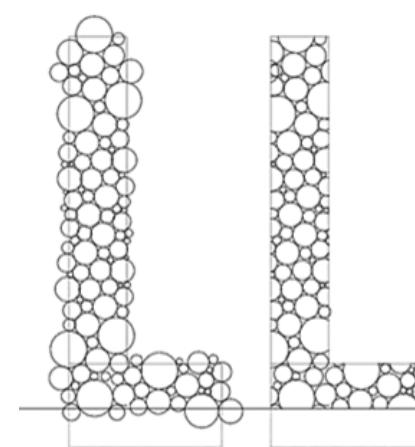
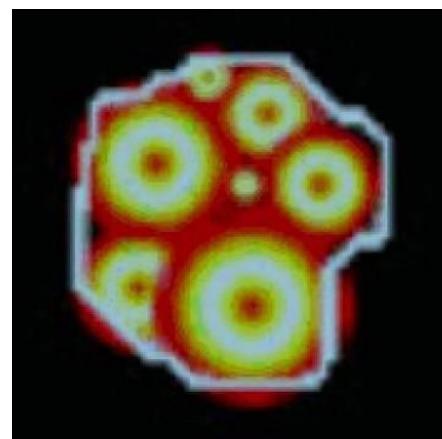
# Applications of Polydisperse Sphere Packings



P. Eberhard et al, 2009



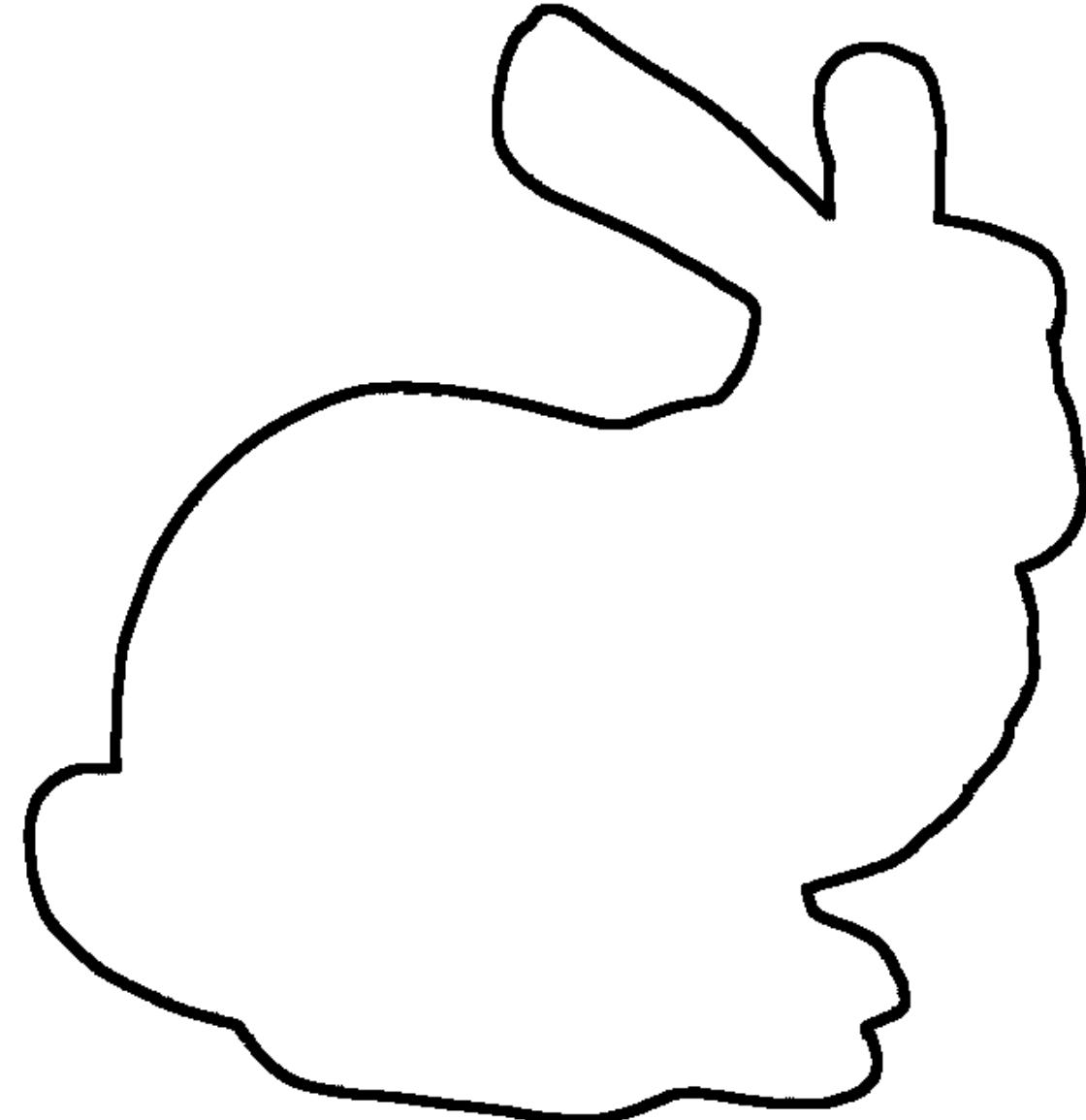
Long Yun et al, 2002



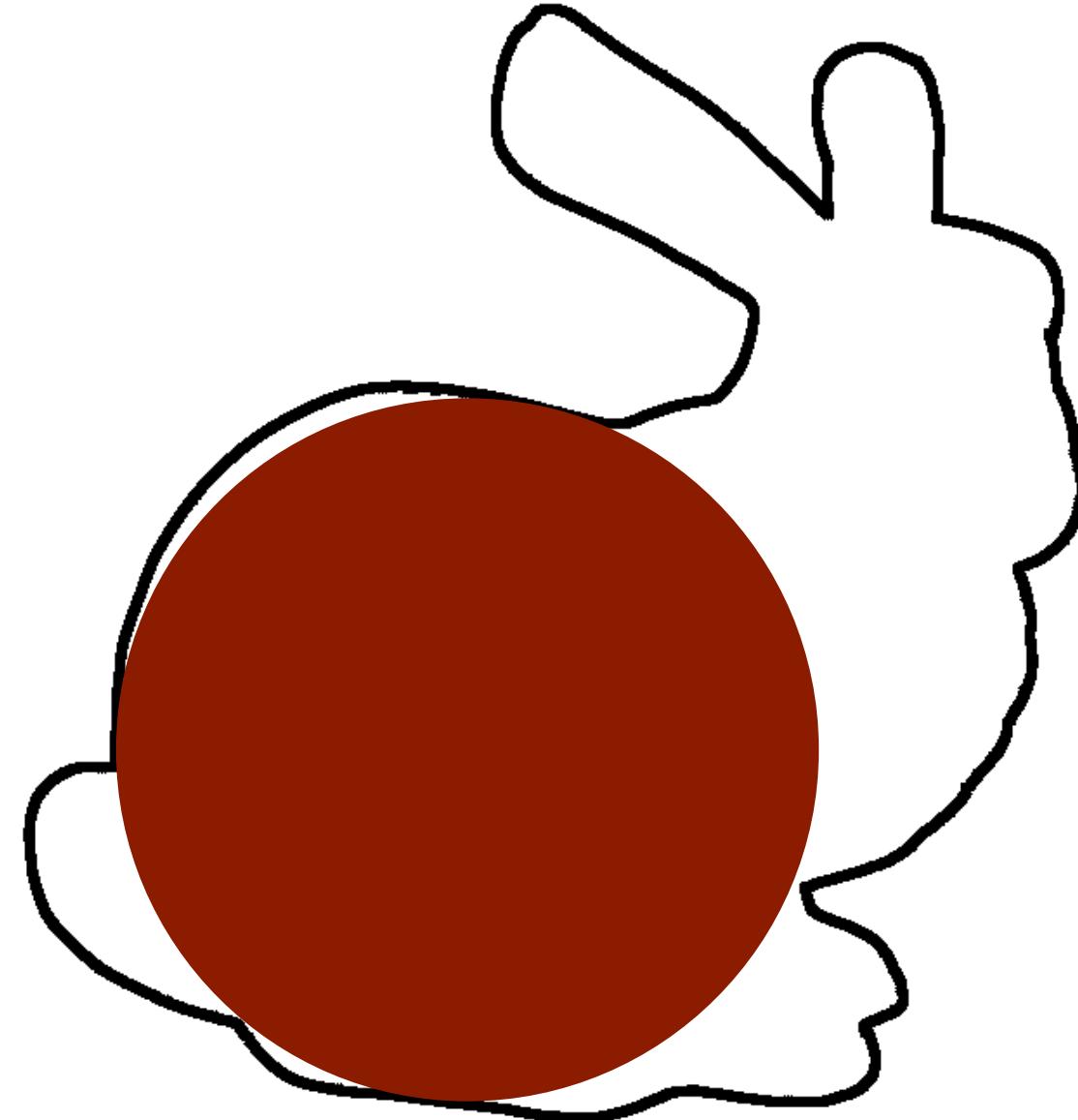
smo architektur, 2006



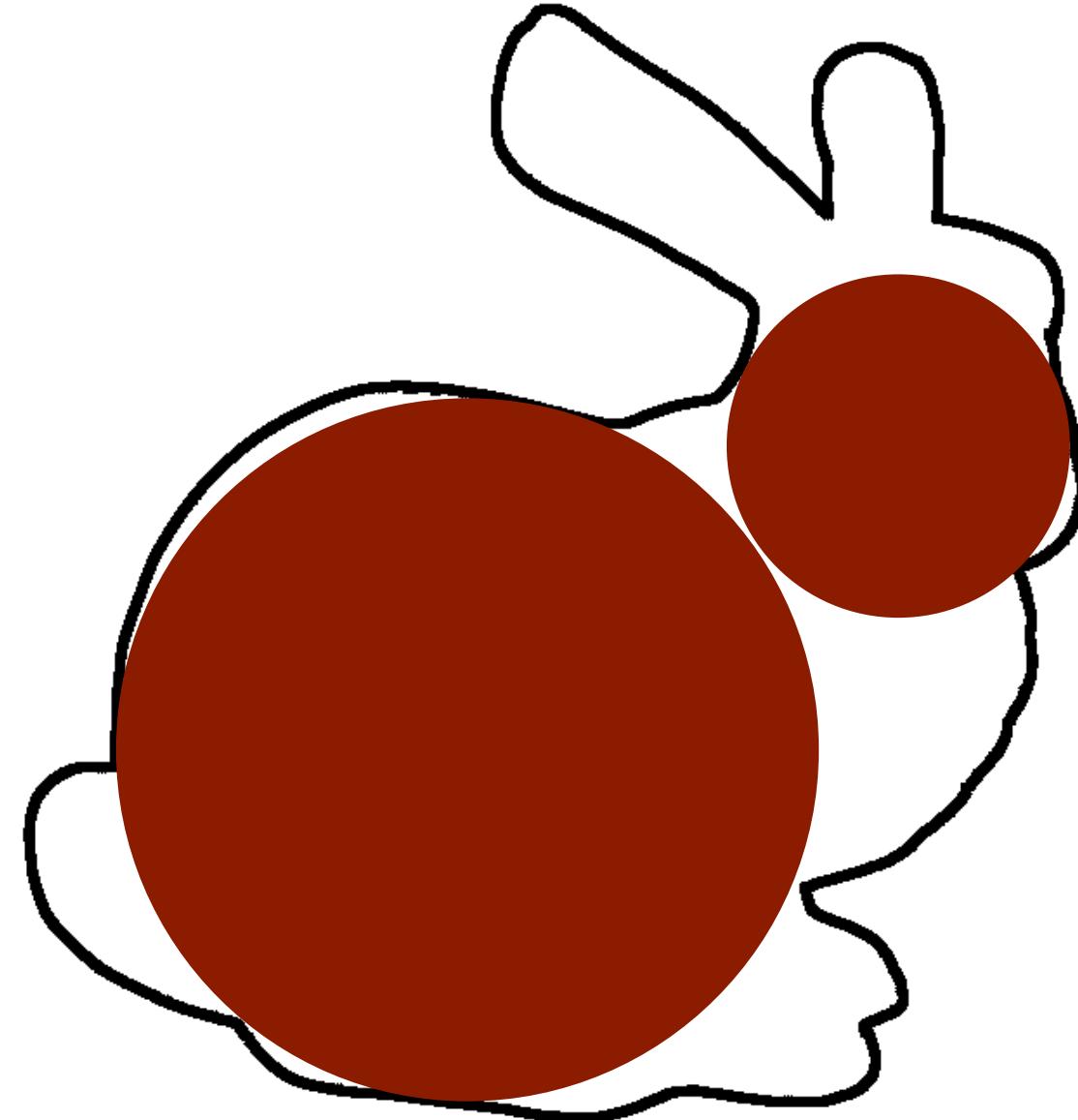
# Basic Idea



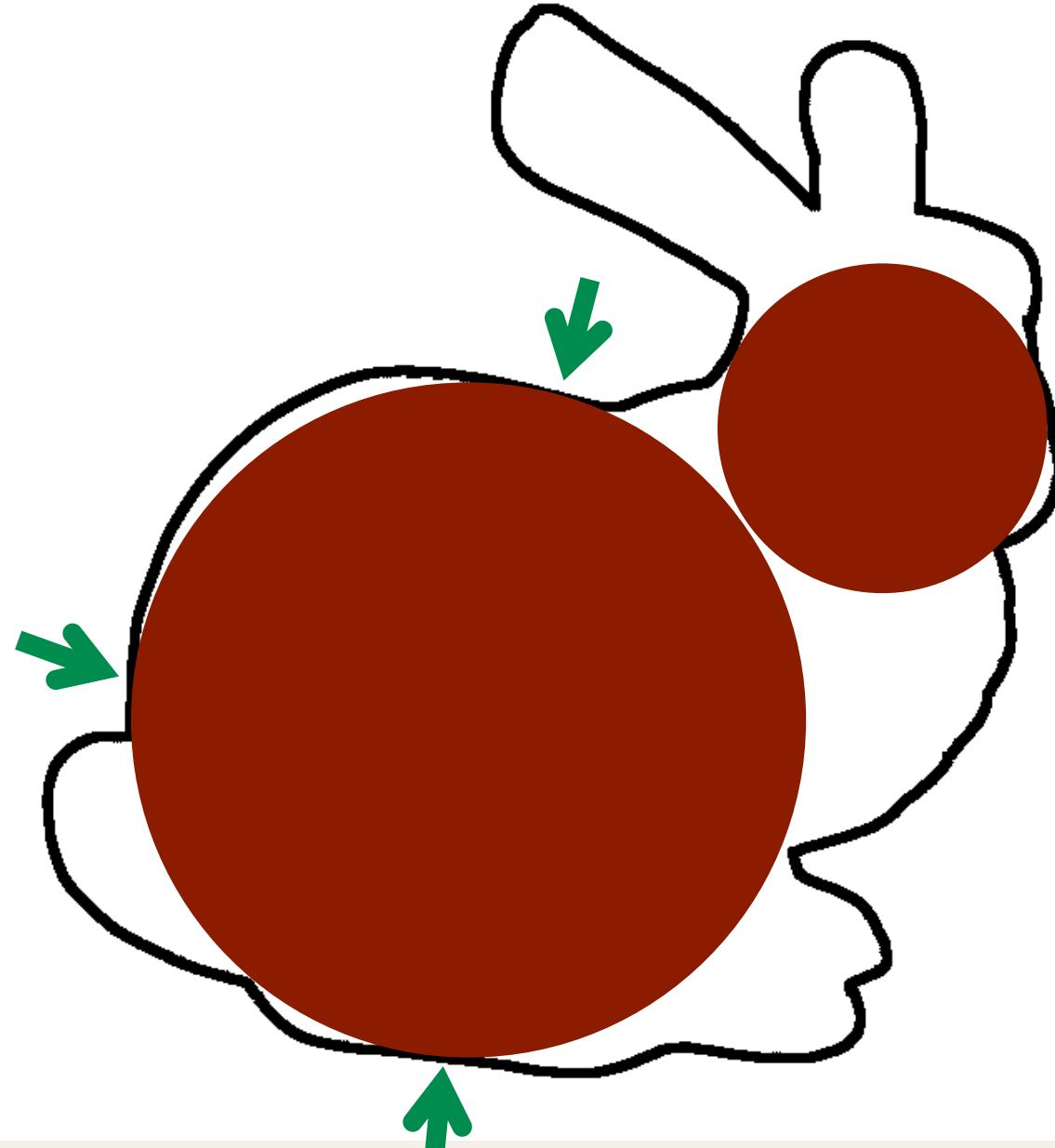
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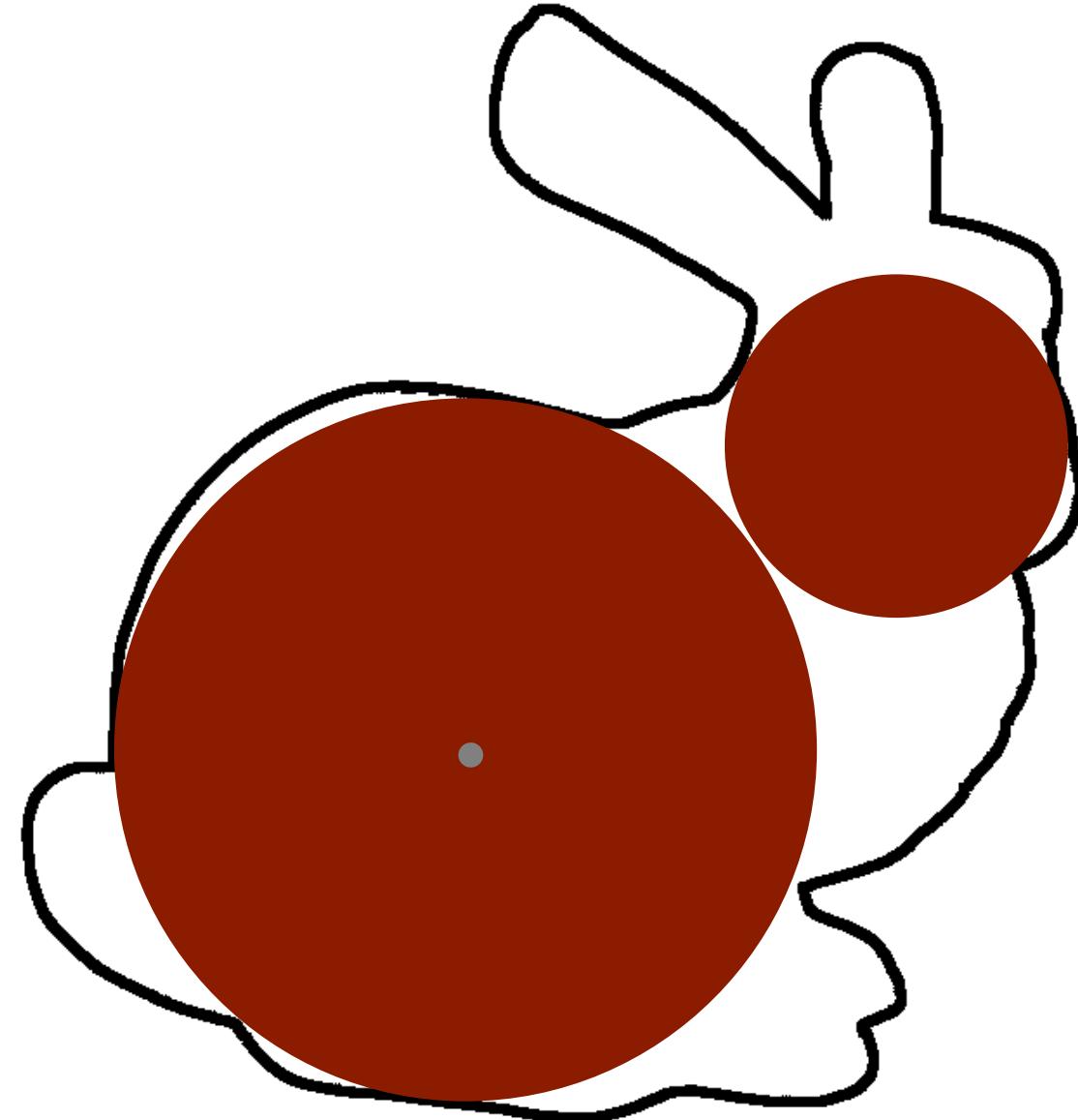
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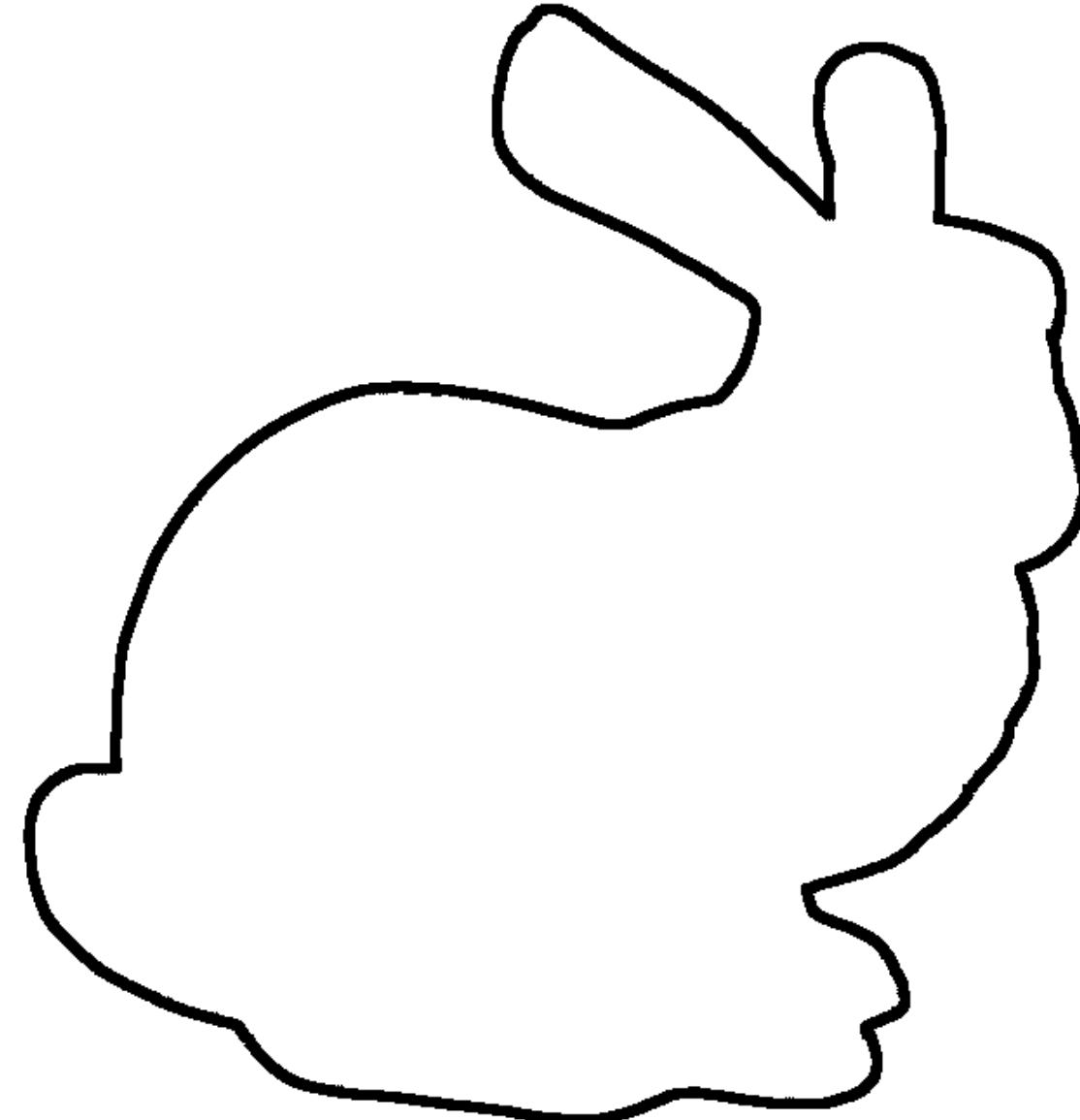
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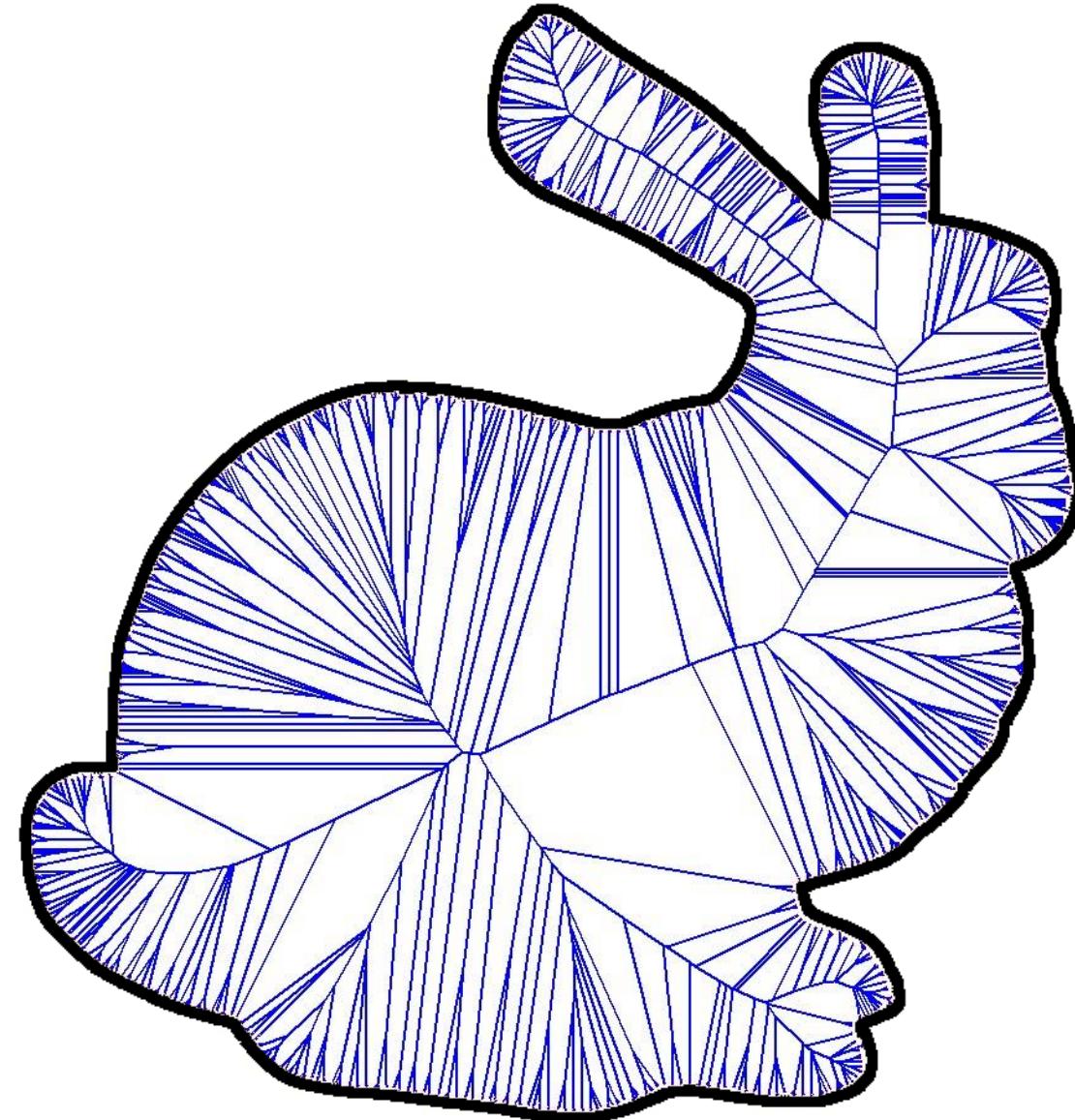
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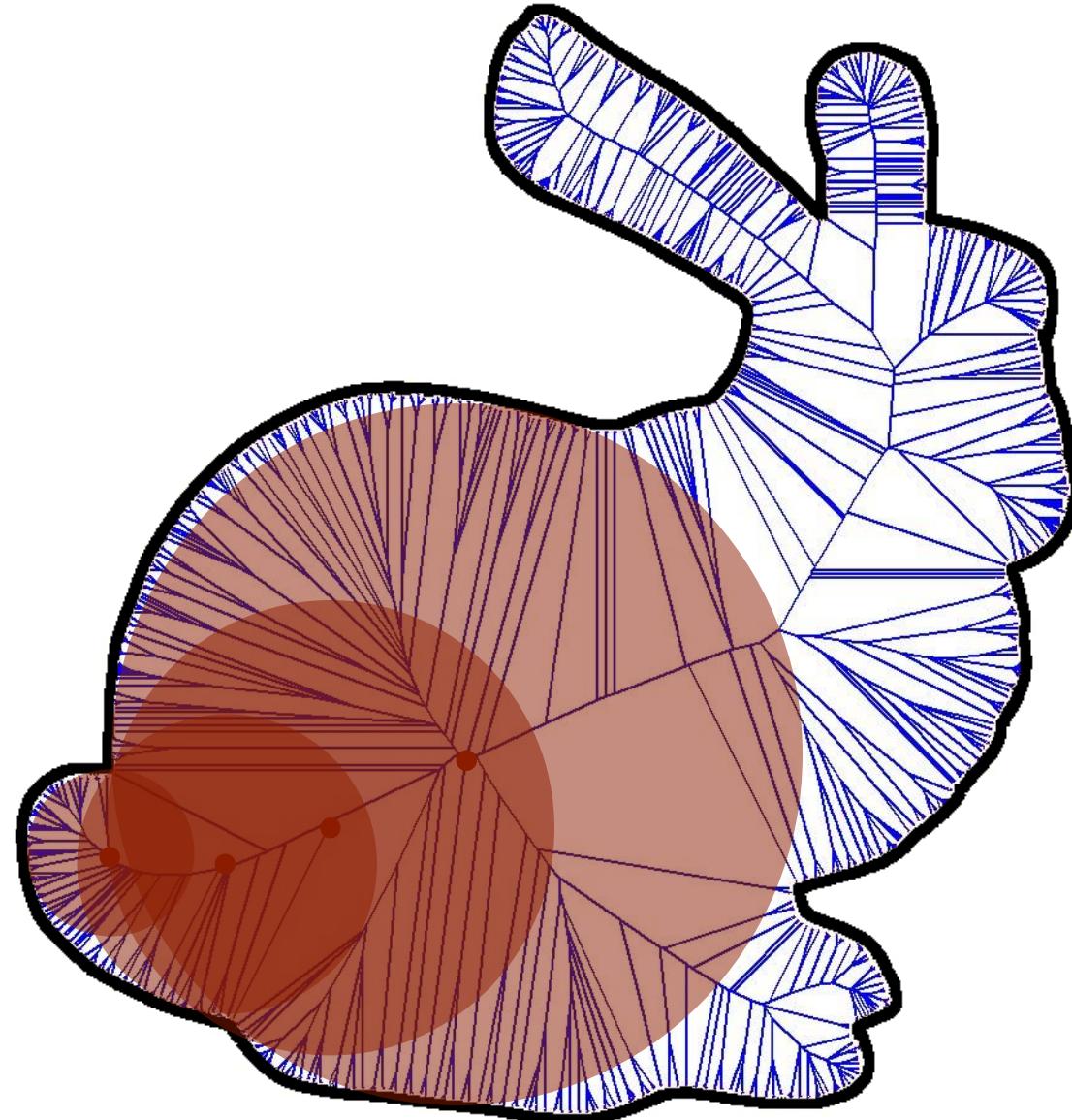
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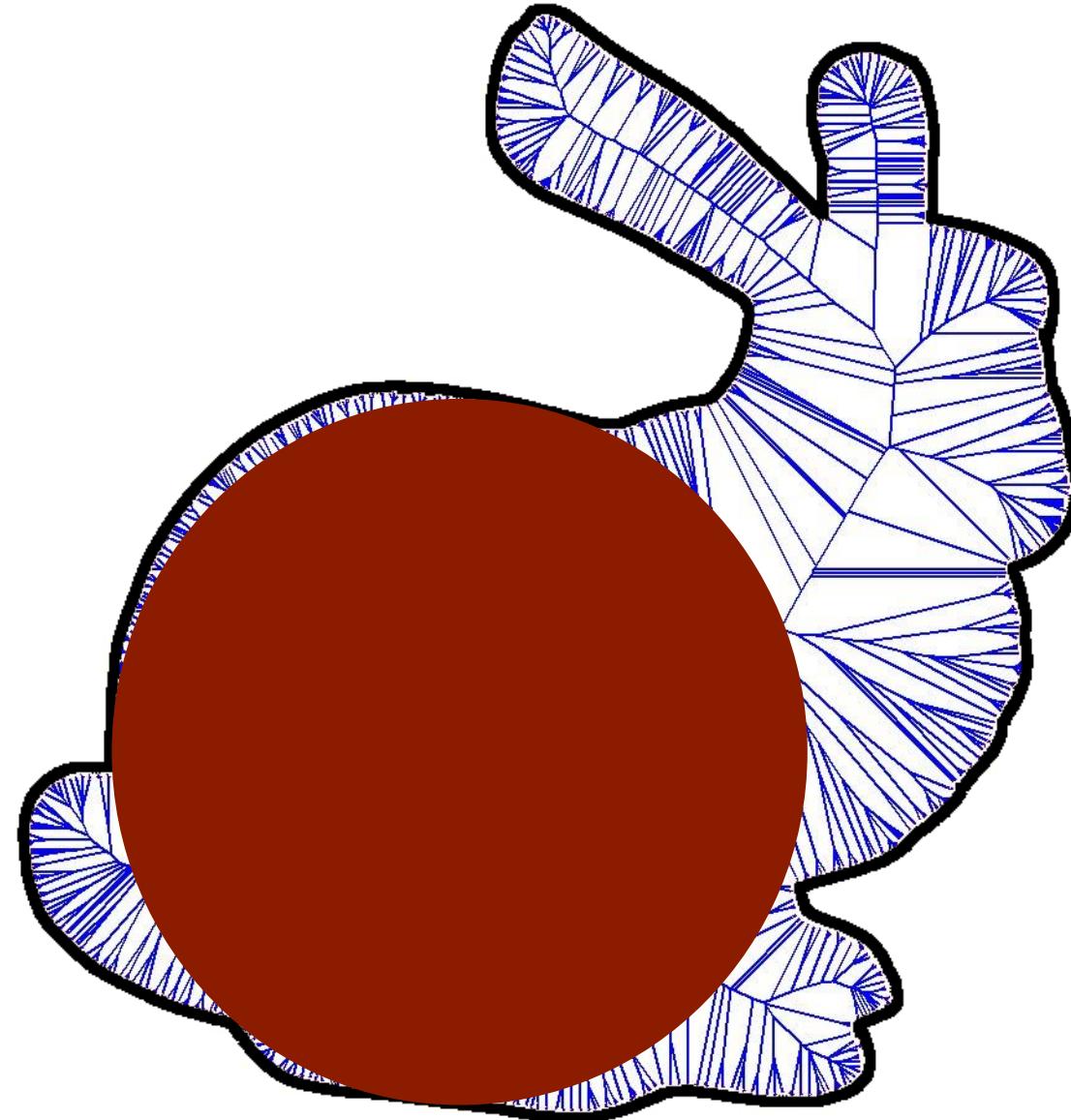
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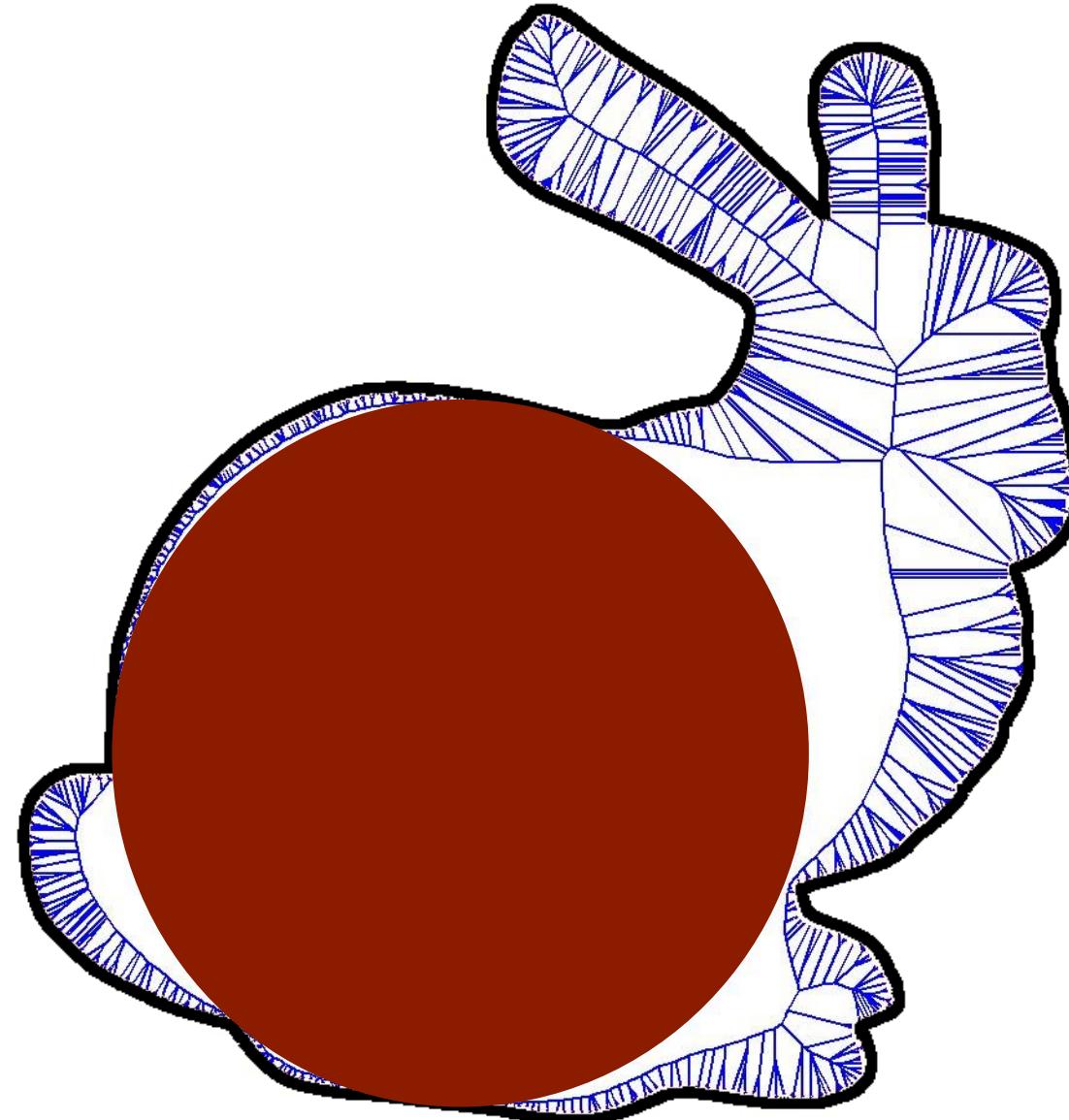
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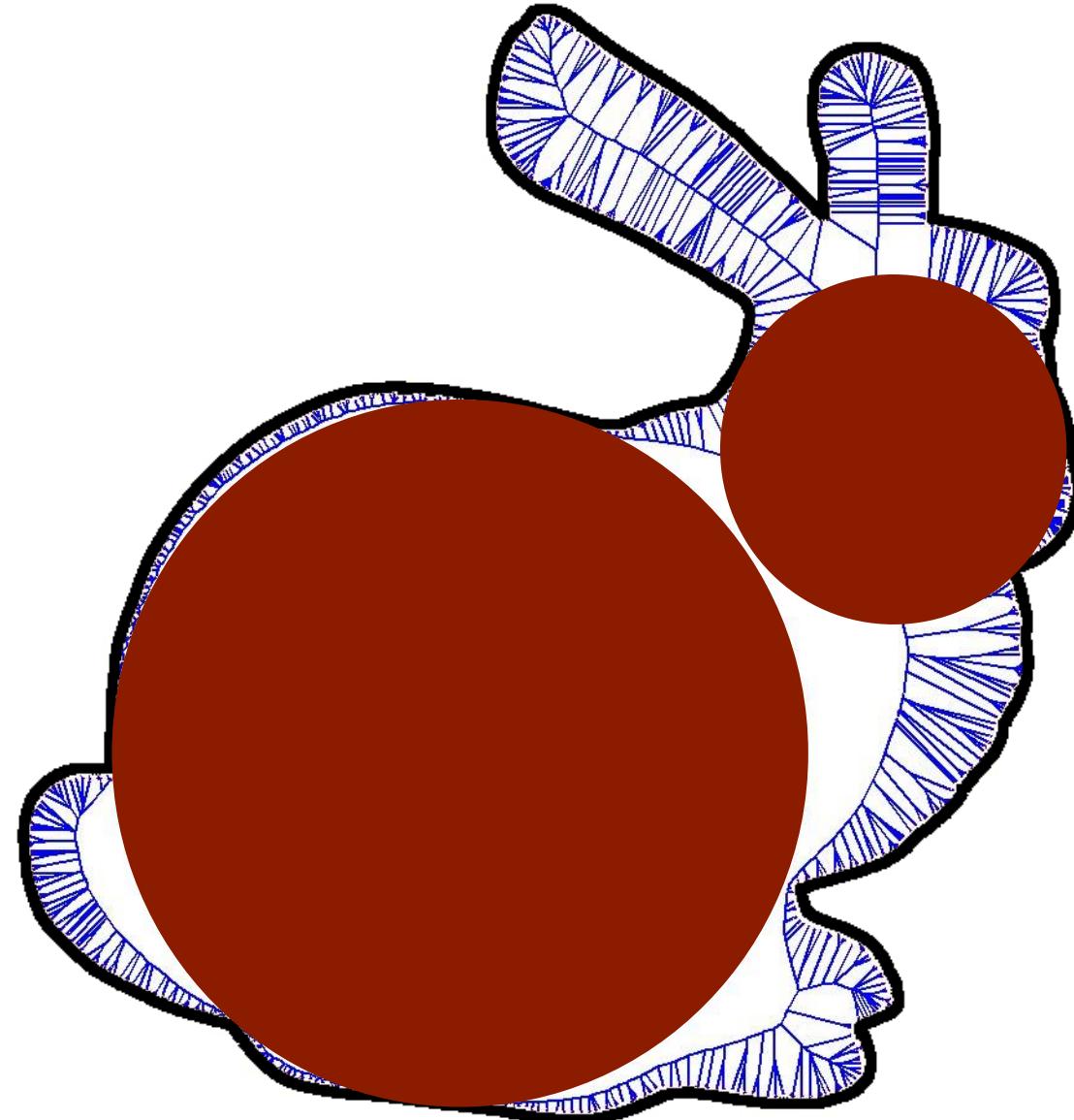
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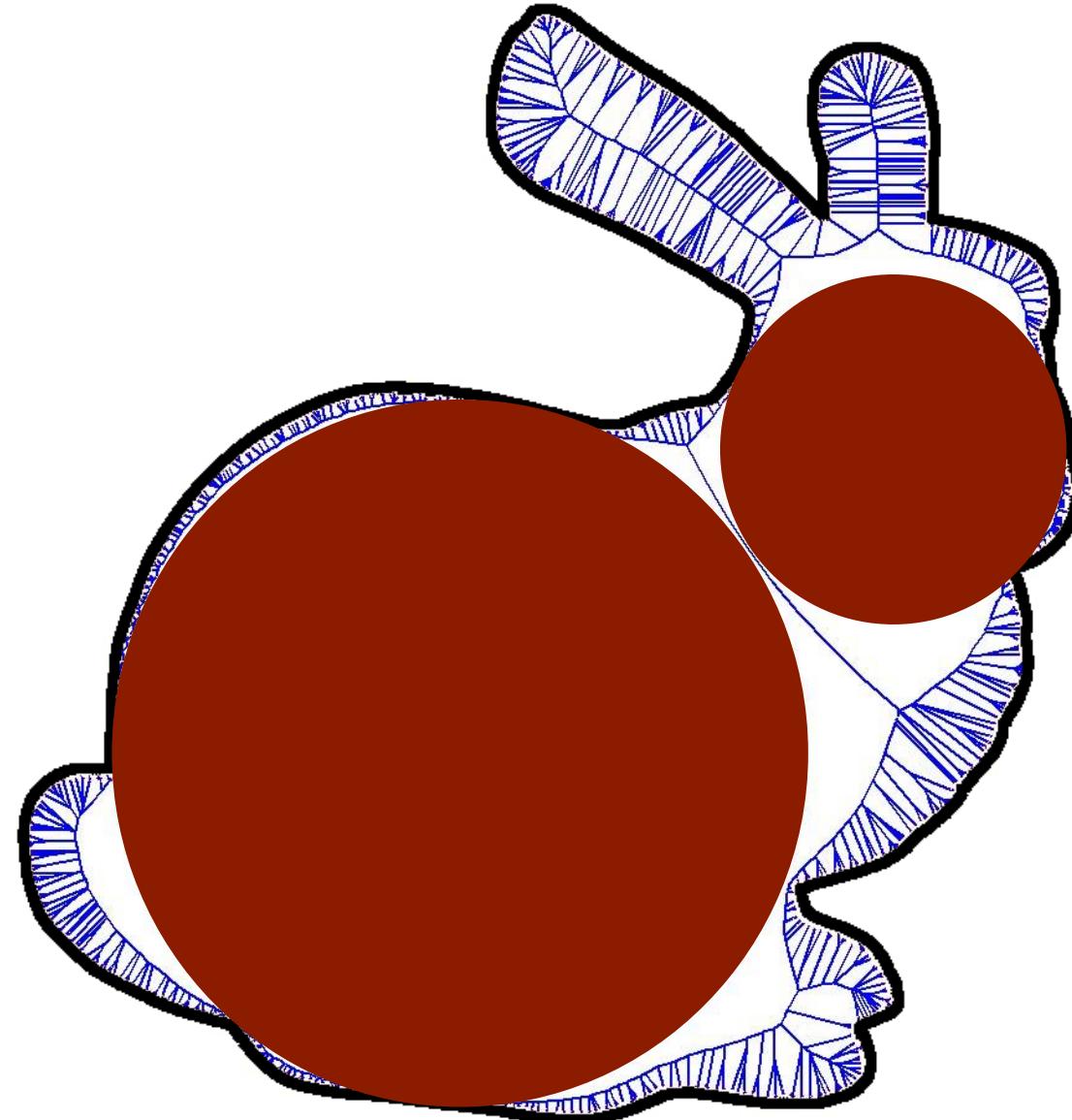
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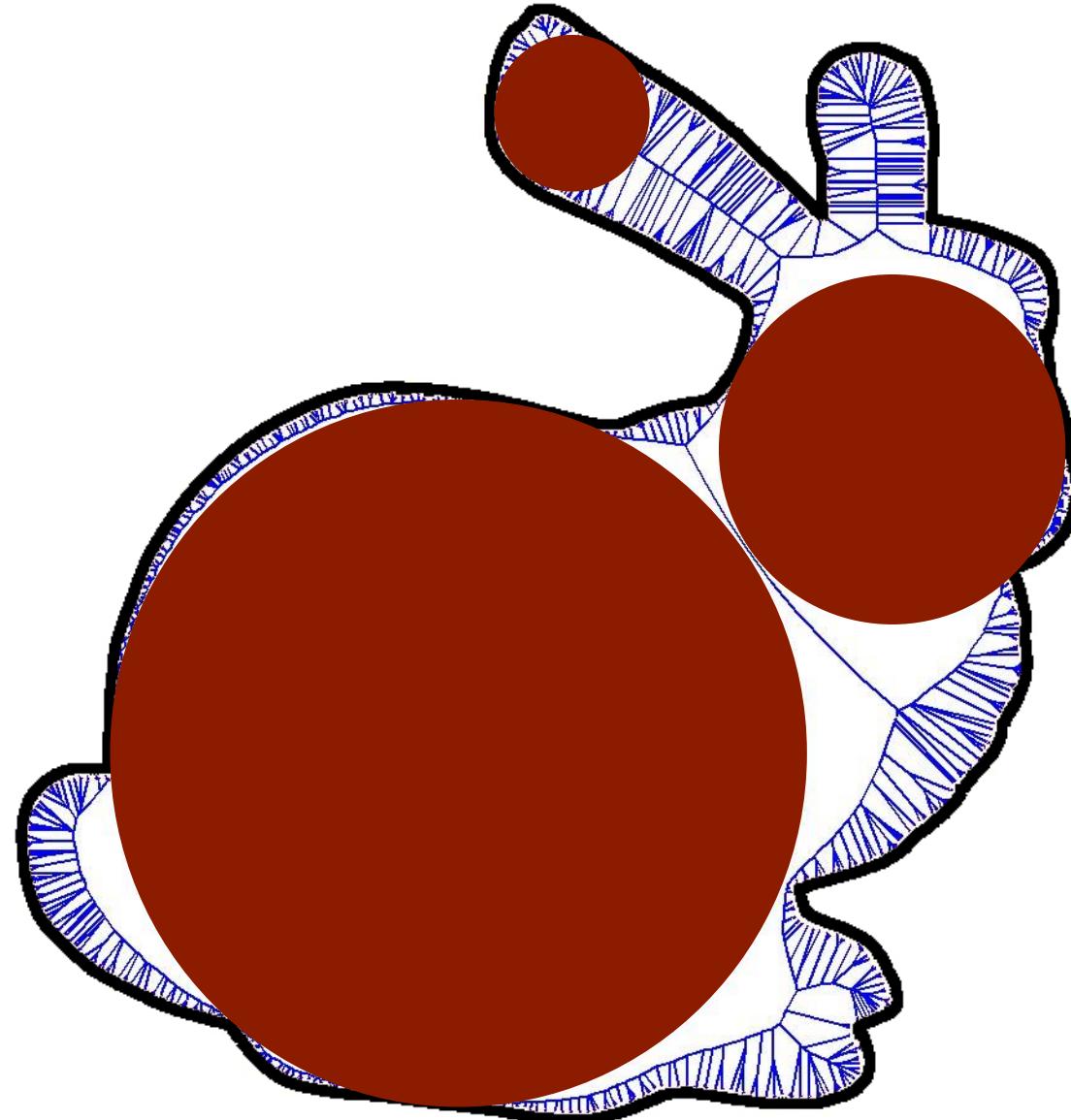
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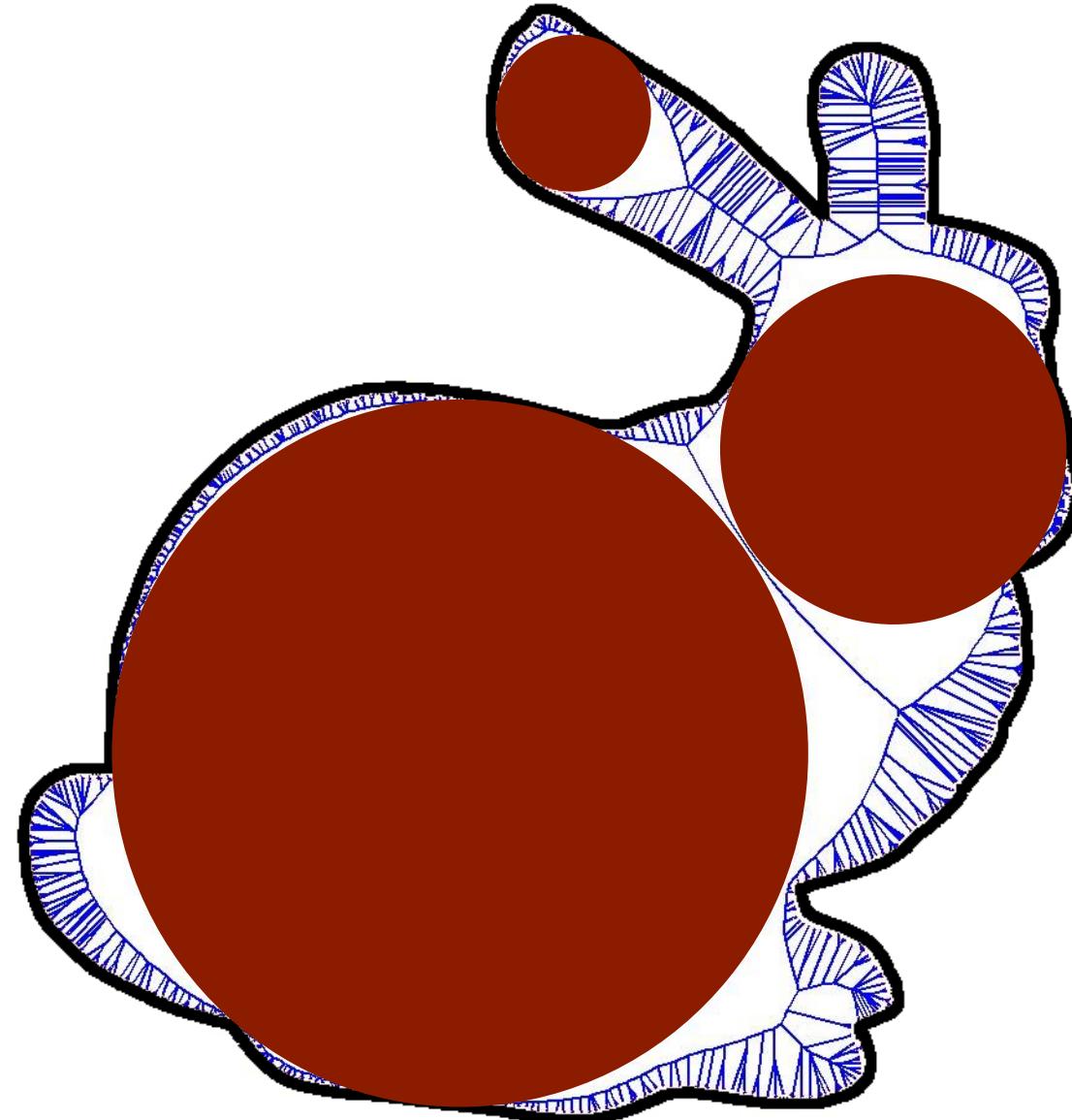
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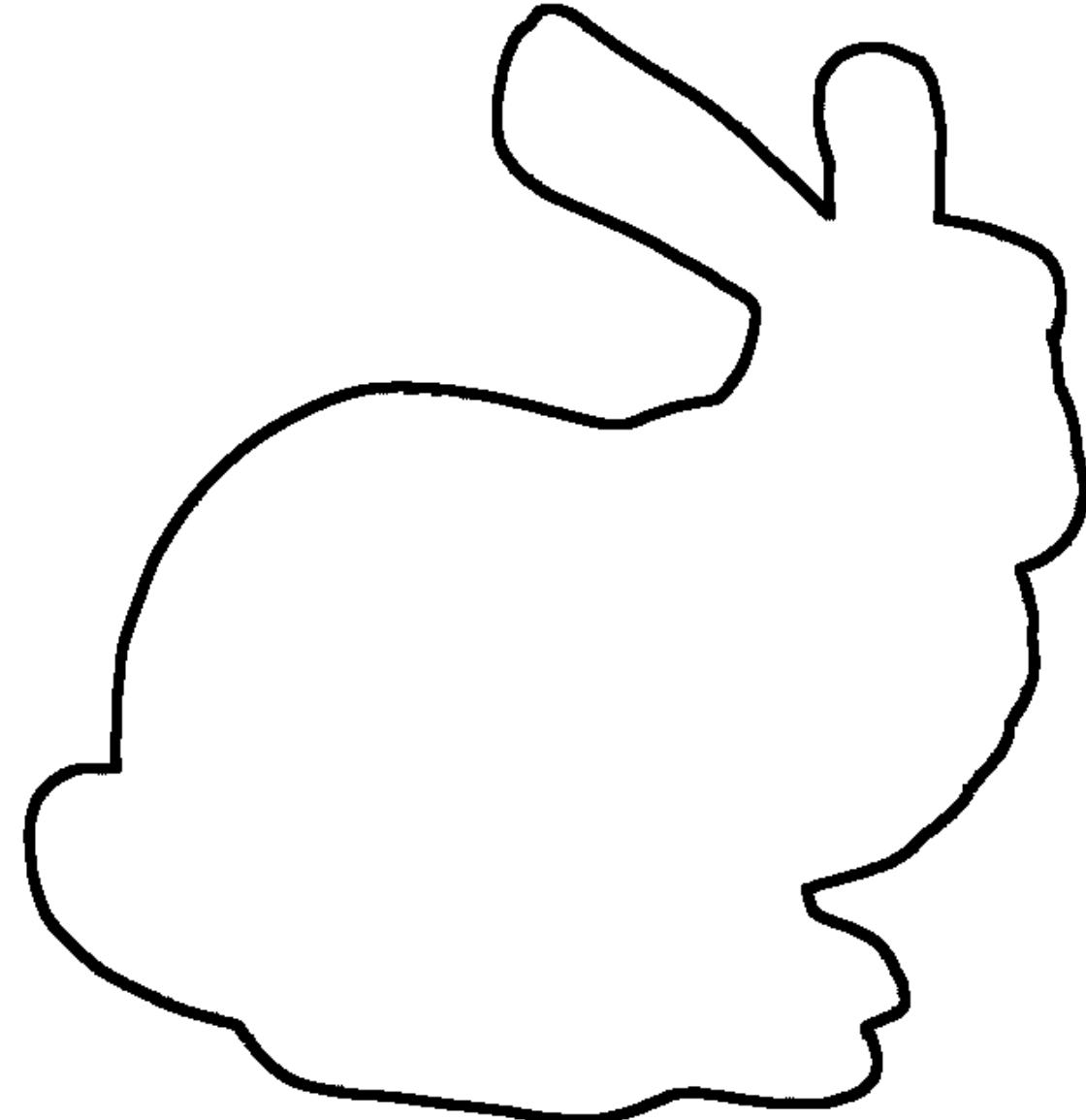
# Basic Idea



# Basic Idea

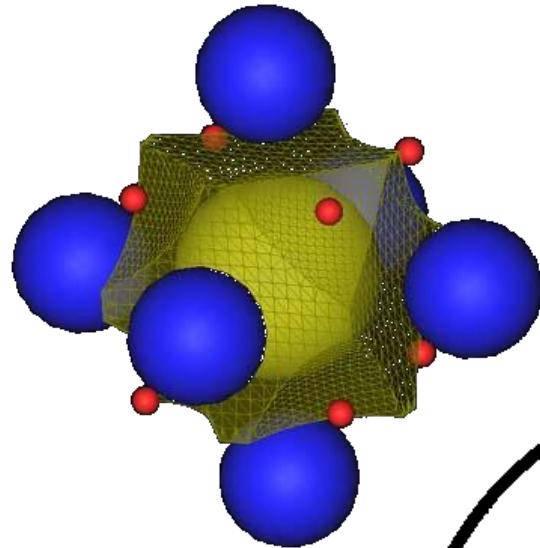


# Basic Idea

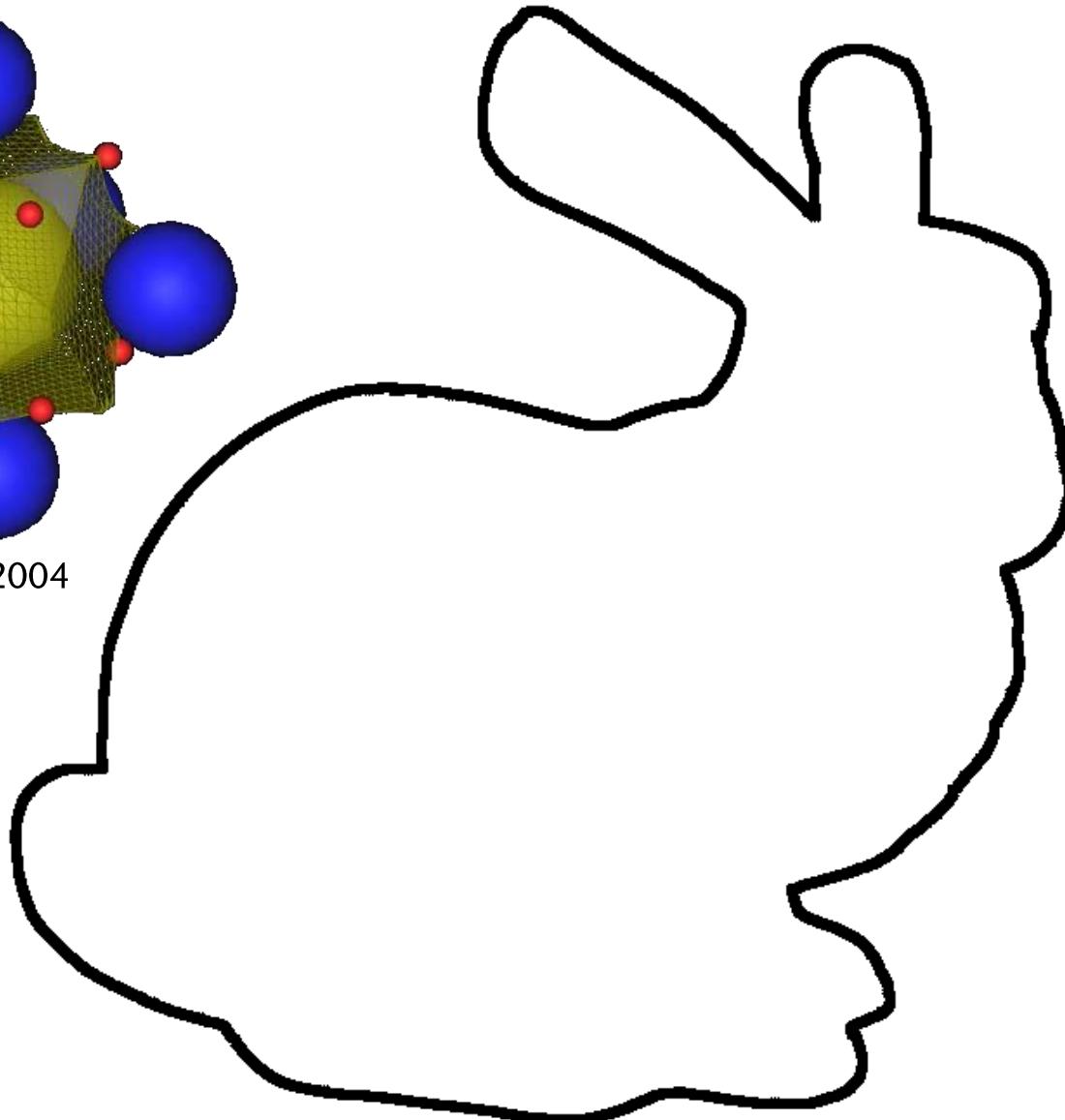




# Basic Idea

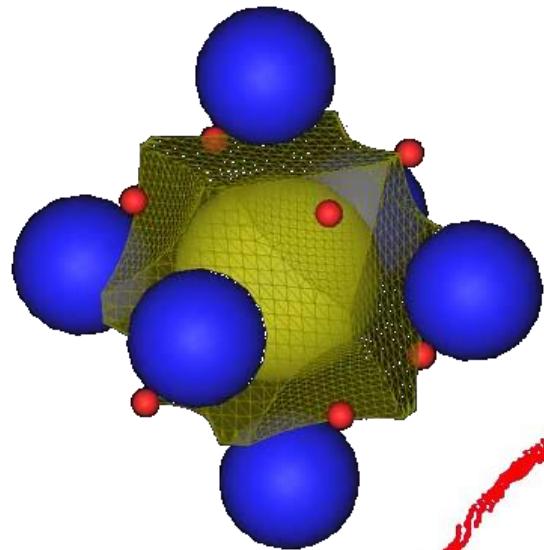


Cho et al., 2004

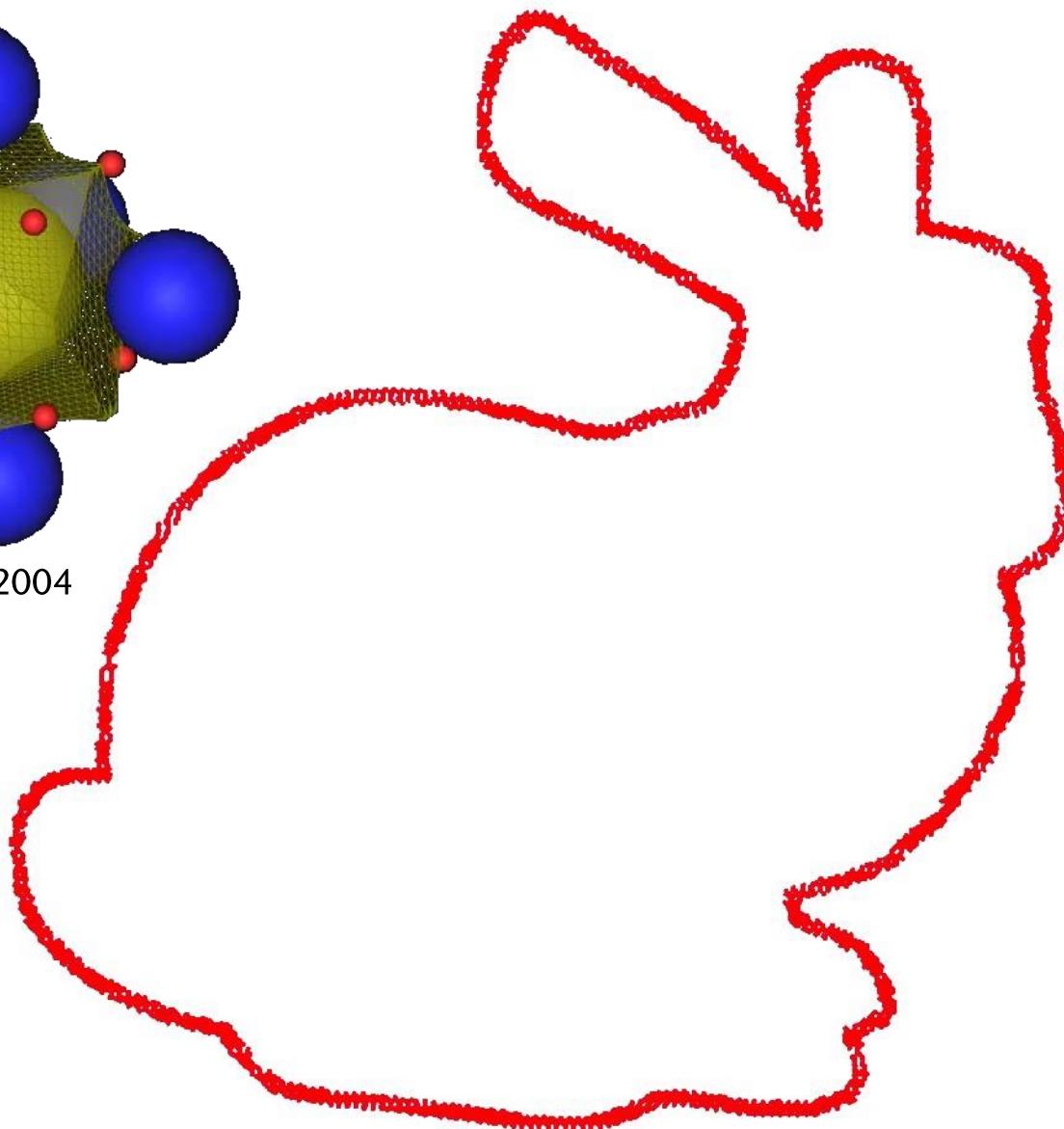




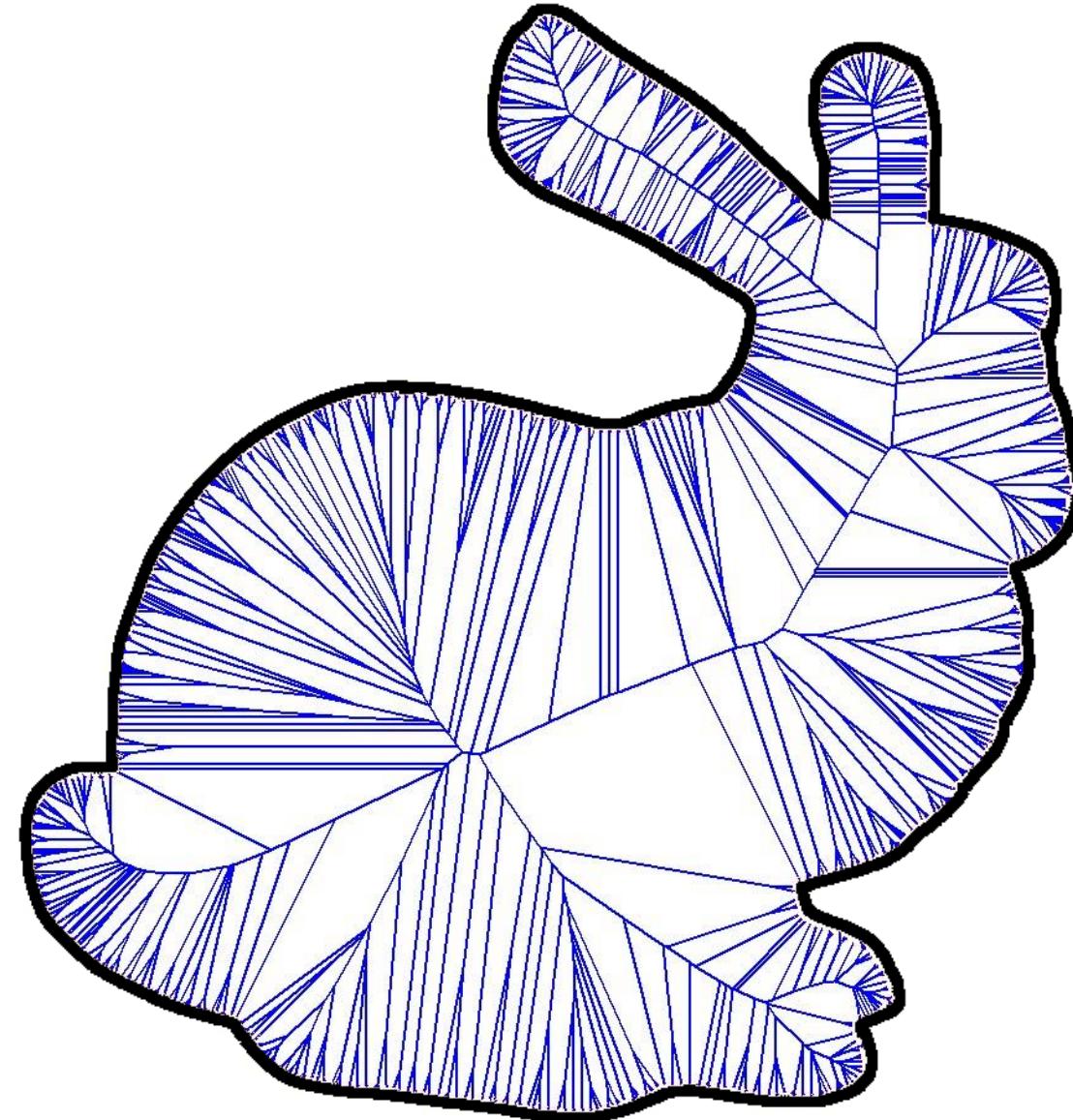
# Basic Idea



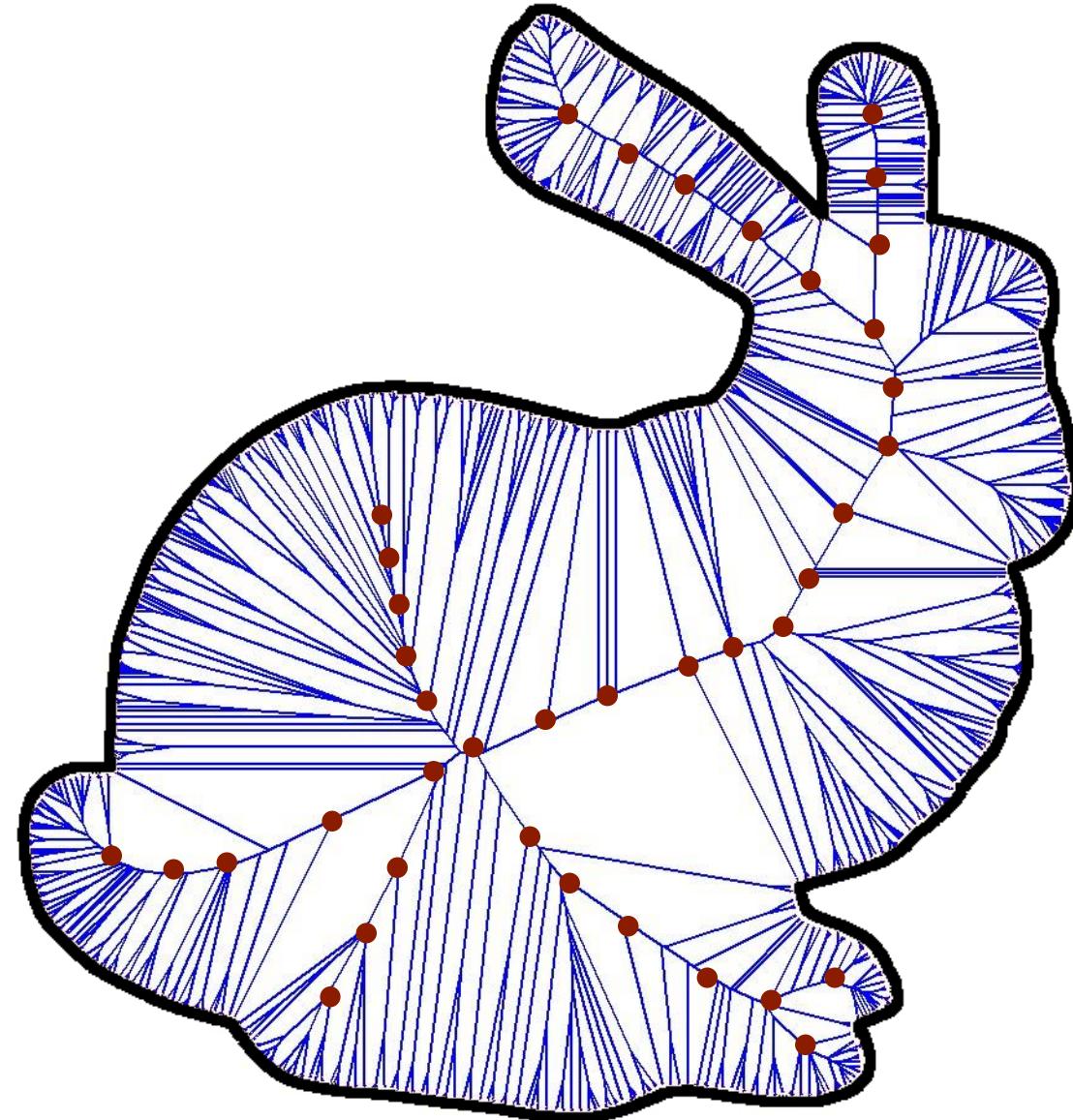
Cho et al., 2004



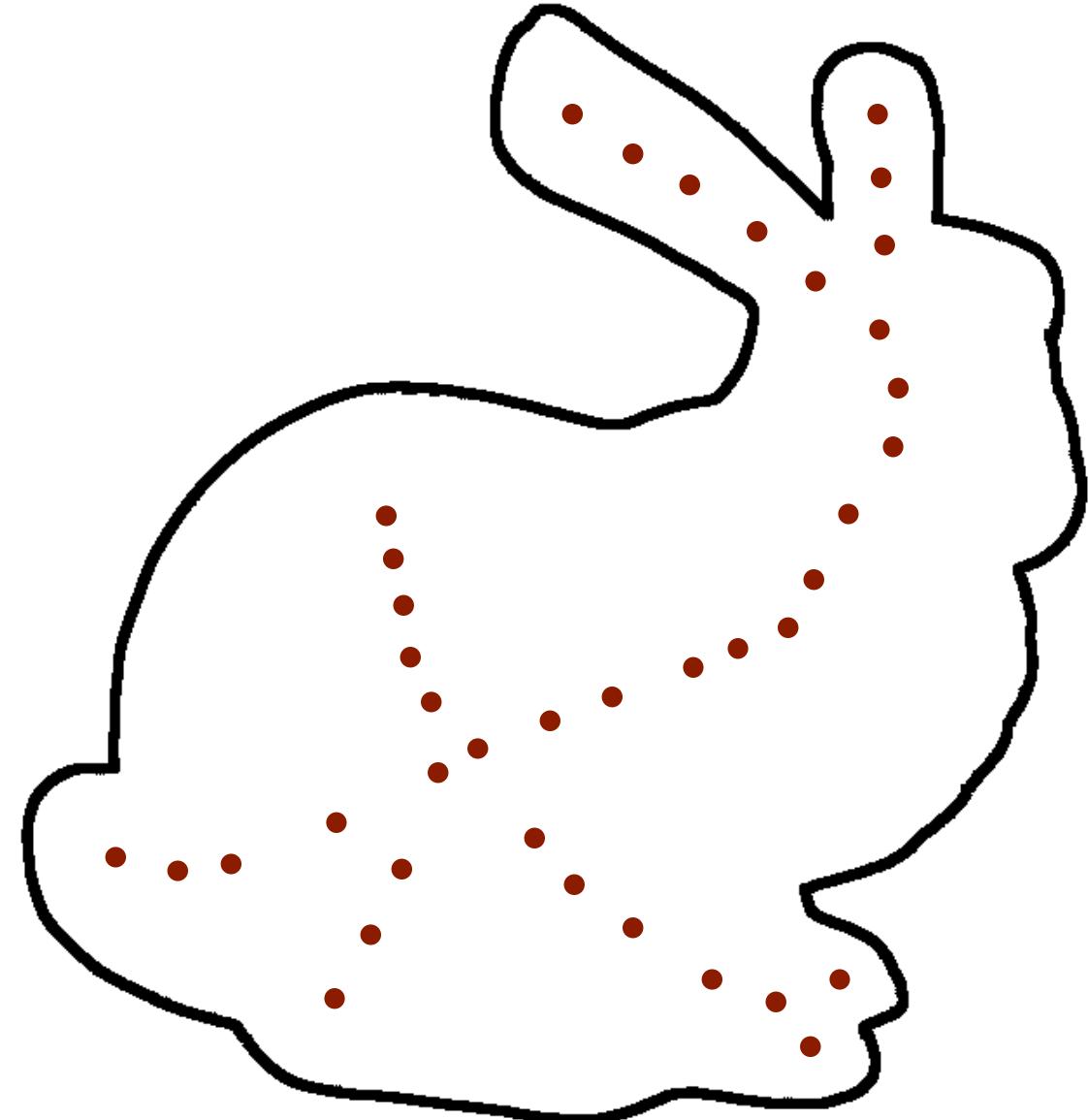
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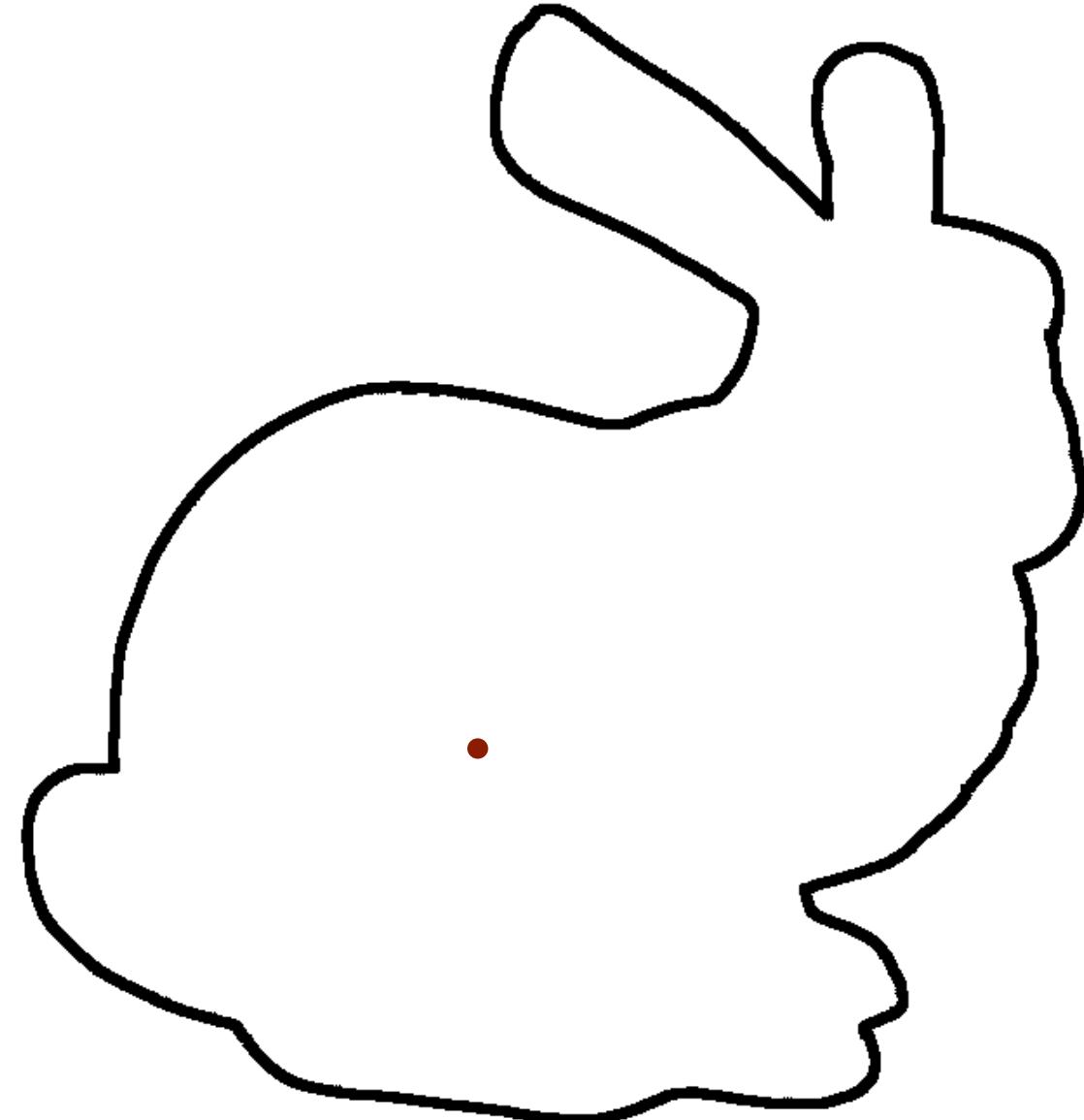
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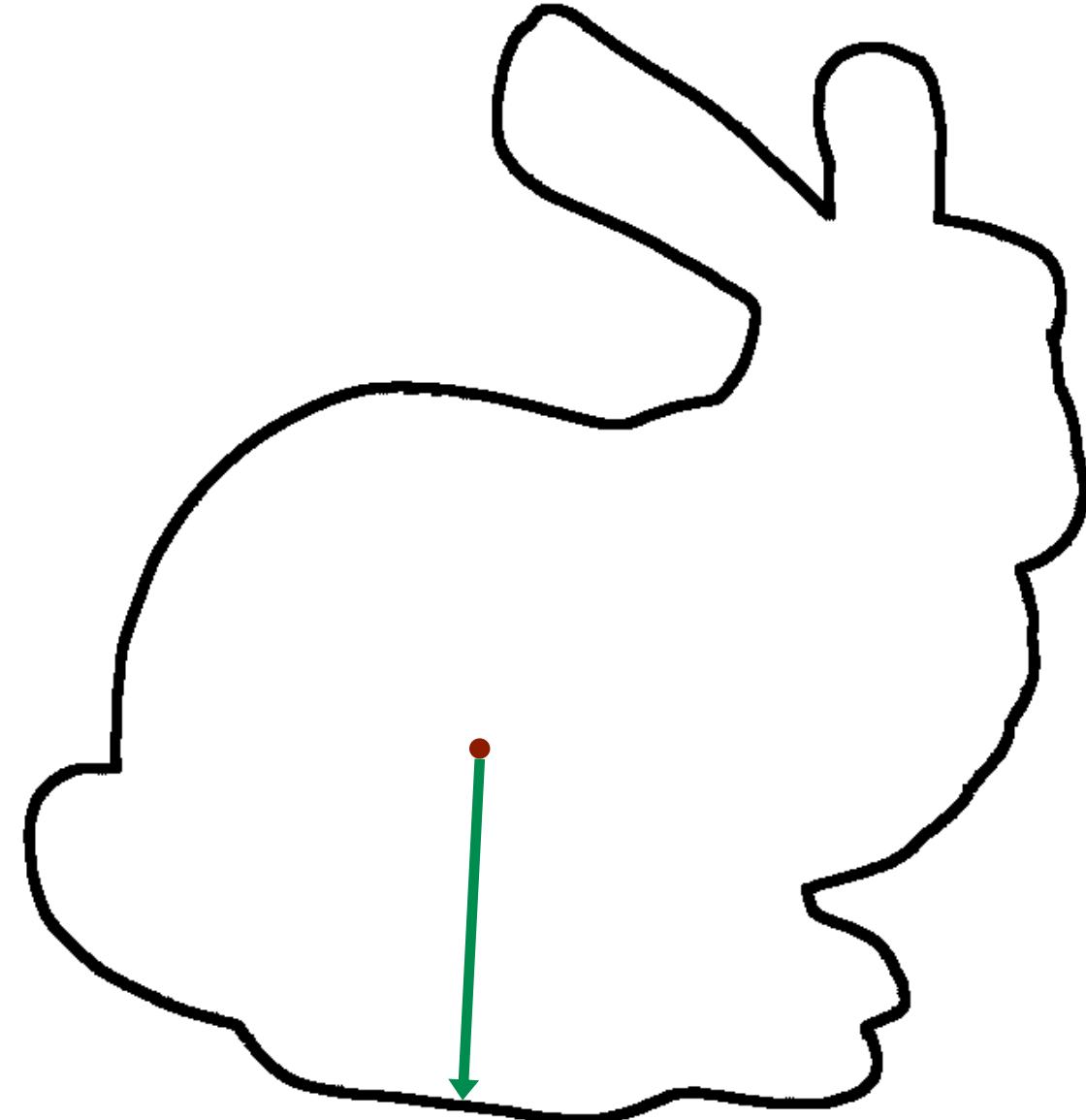
# Basic Idea



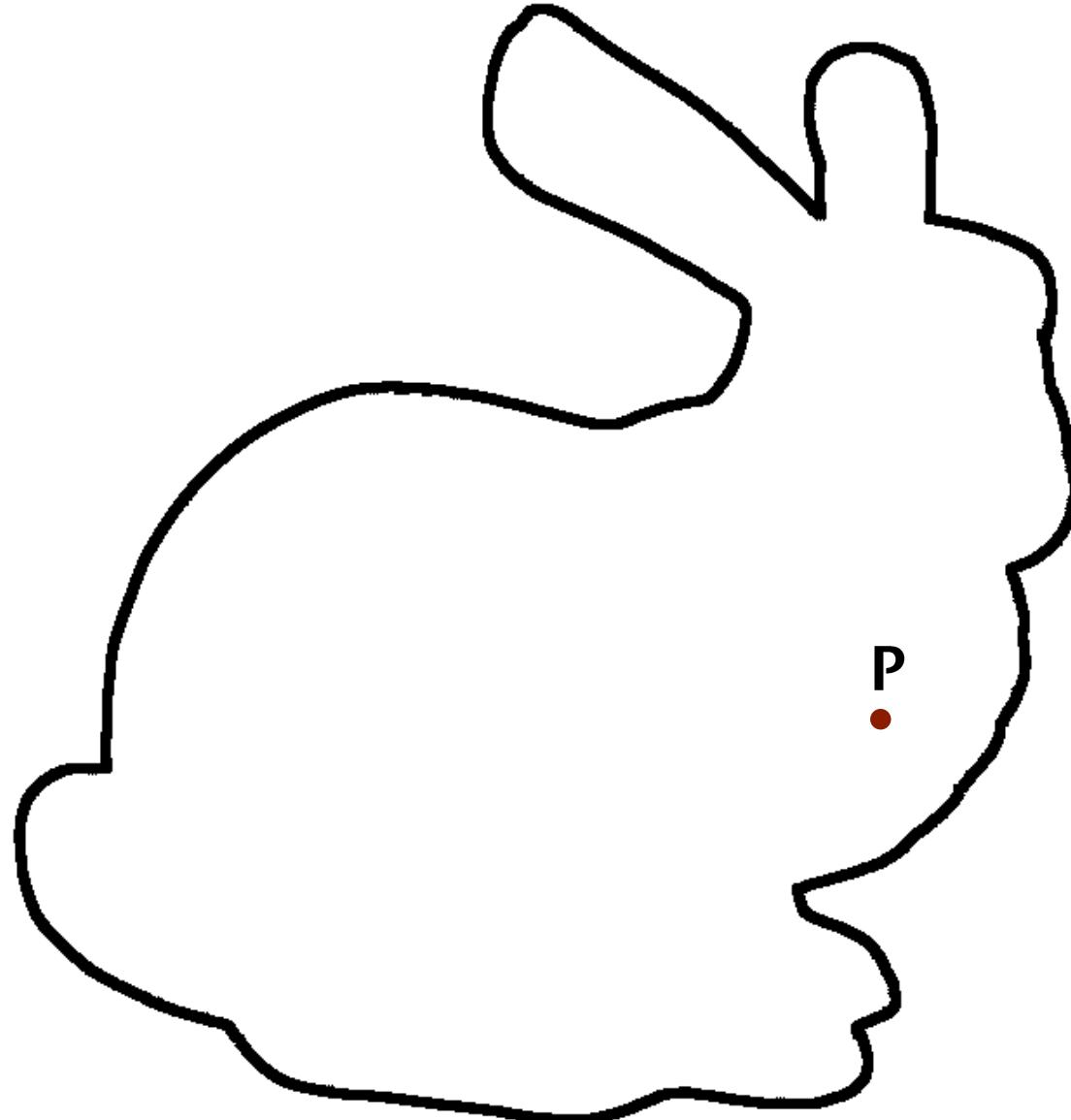
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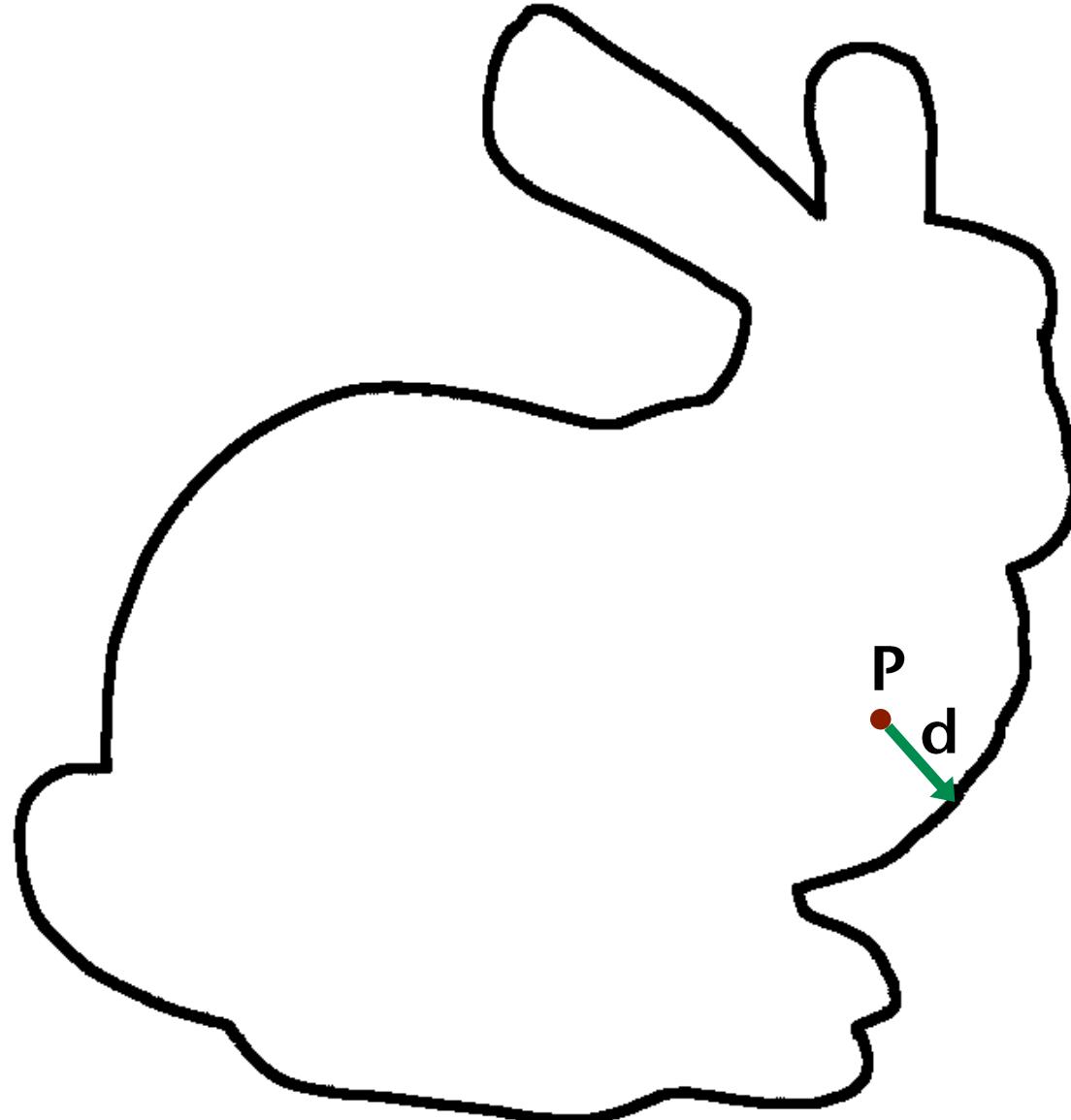
# Basic Idea



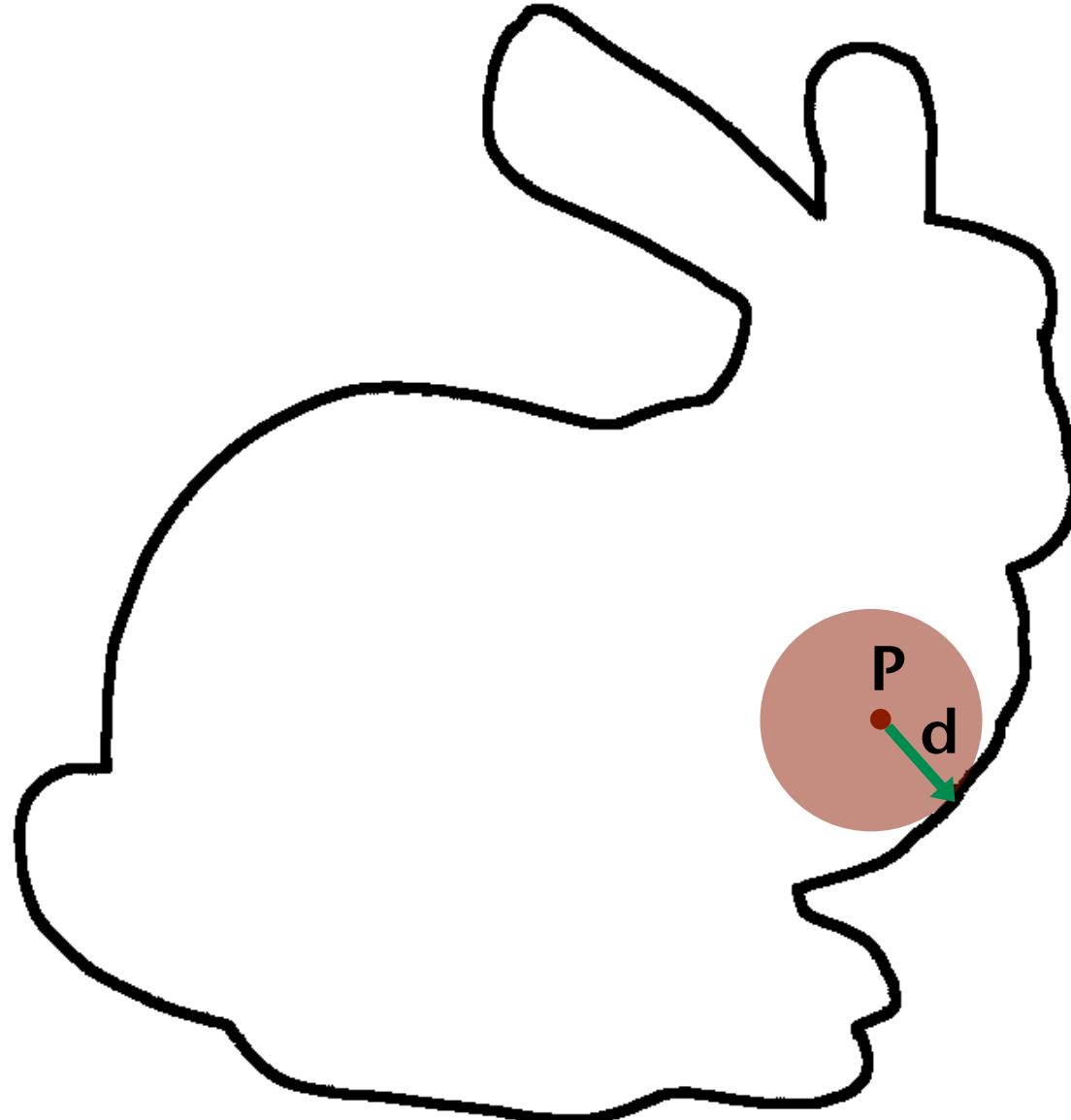
# Protosphere - Basic Algorithm



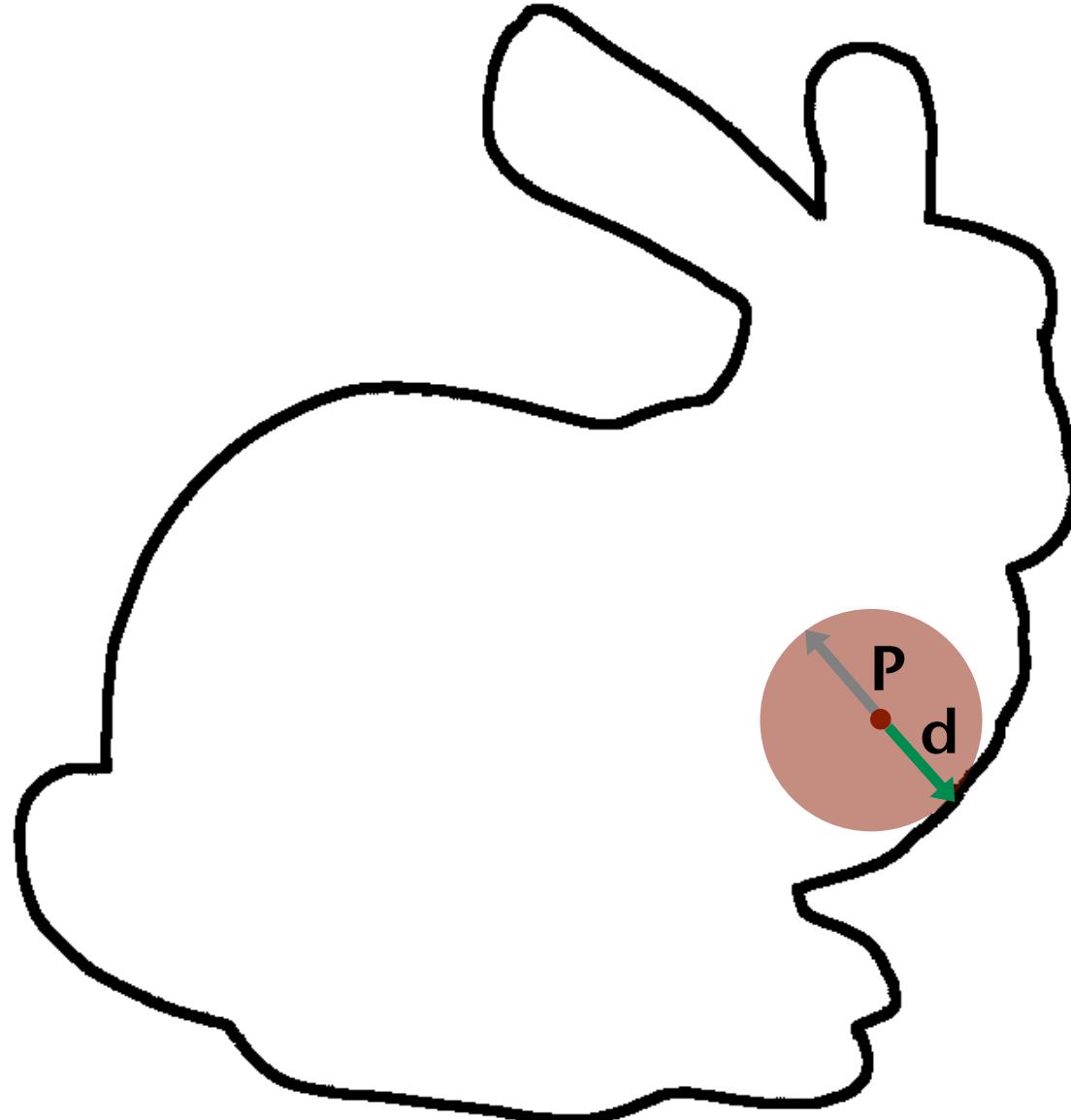
# Protosphere - Basic Algorithm



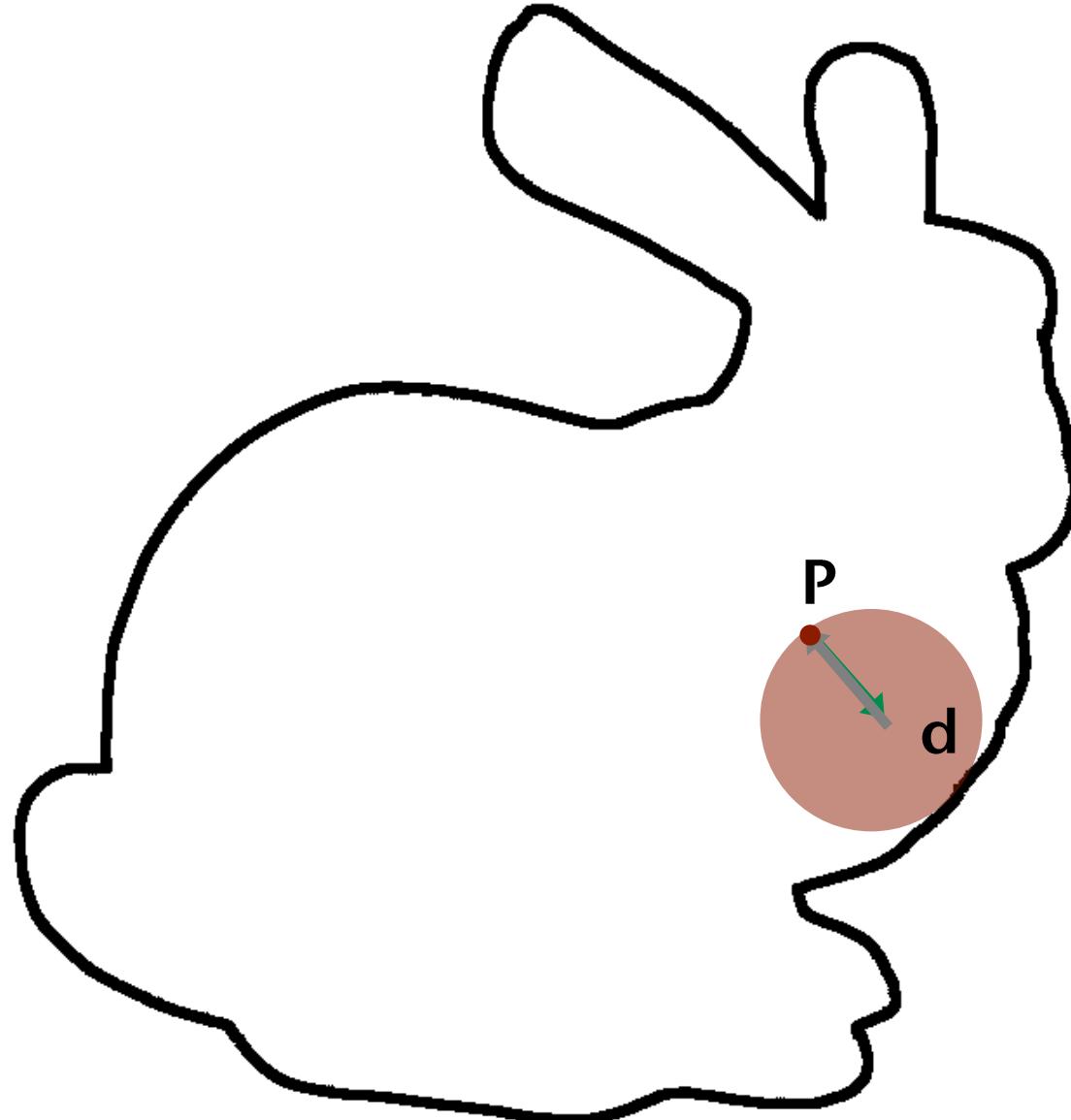
# Protosphere - Basic Algorithm



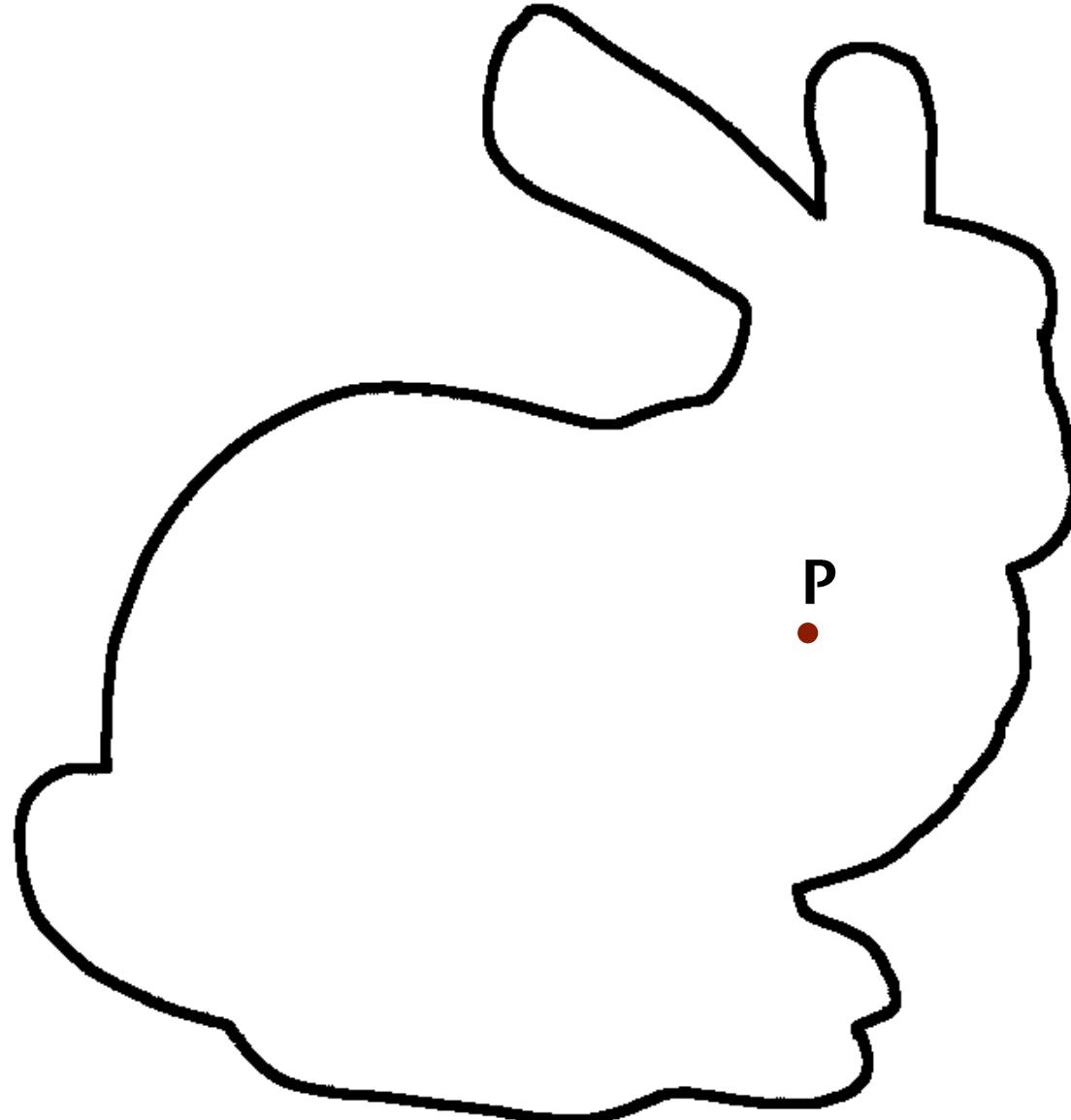
# Protosphere - Basic Algorithm



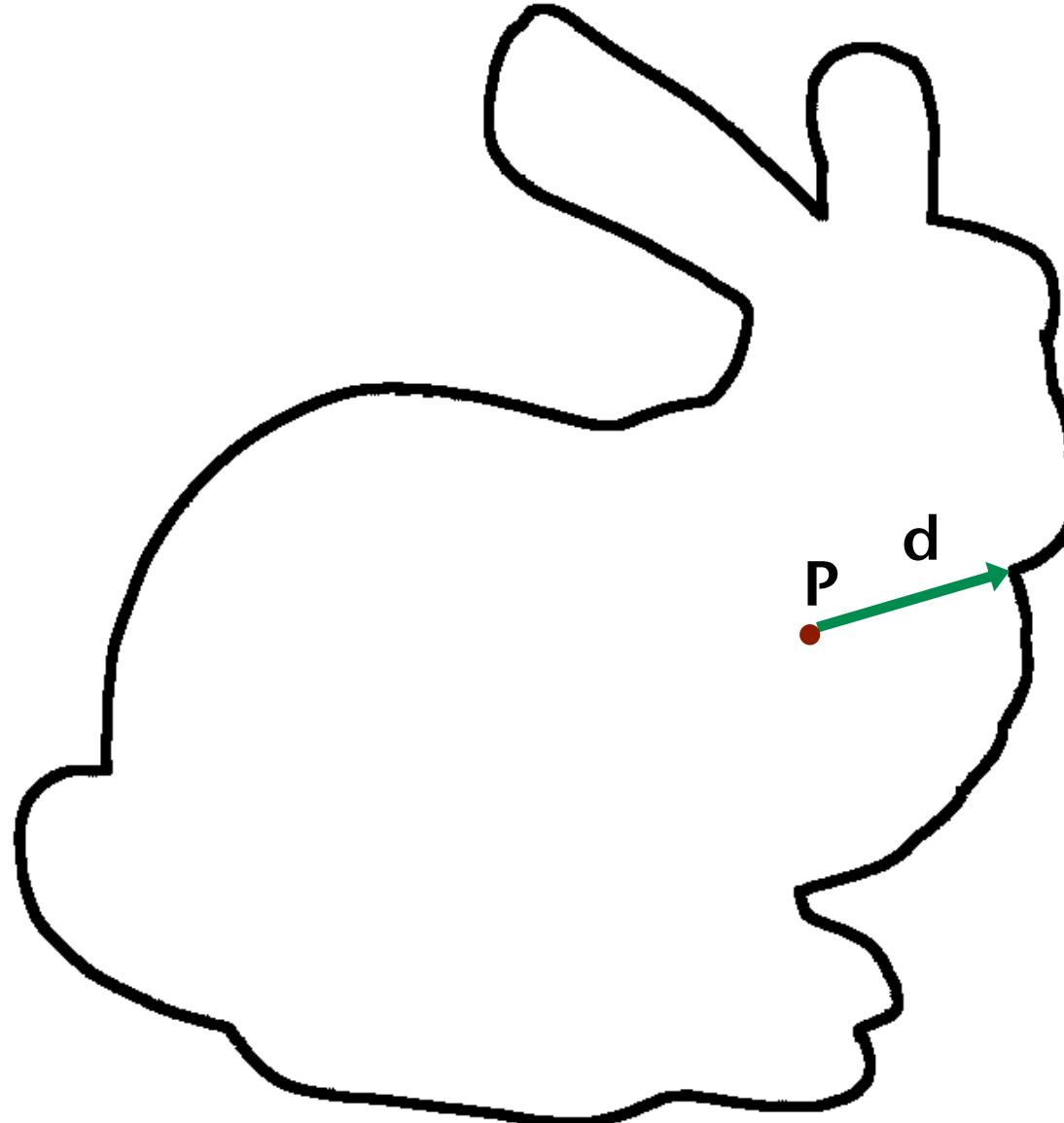
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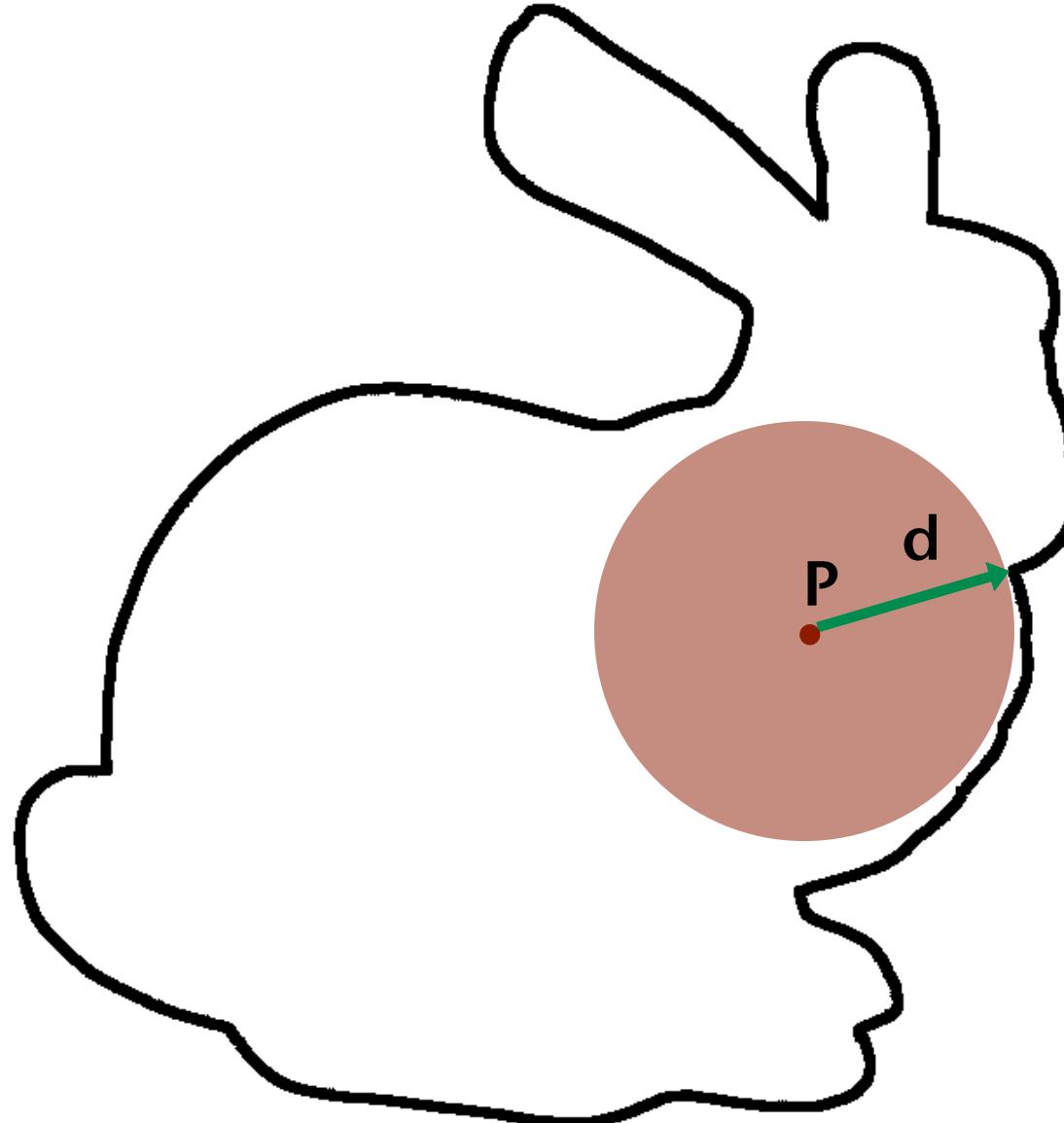
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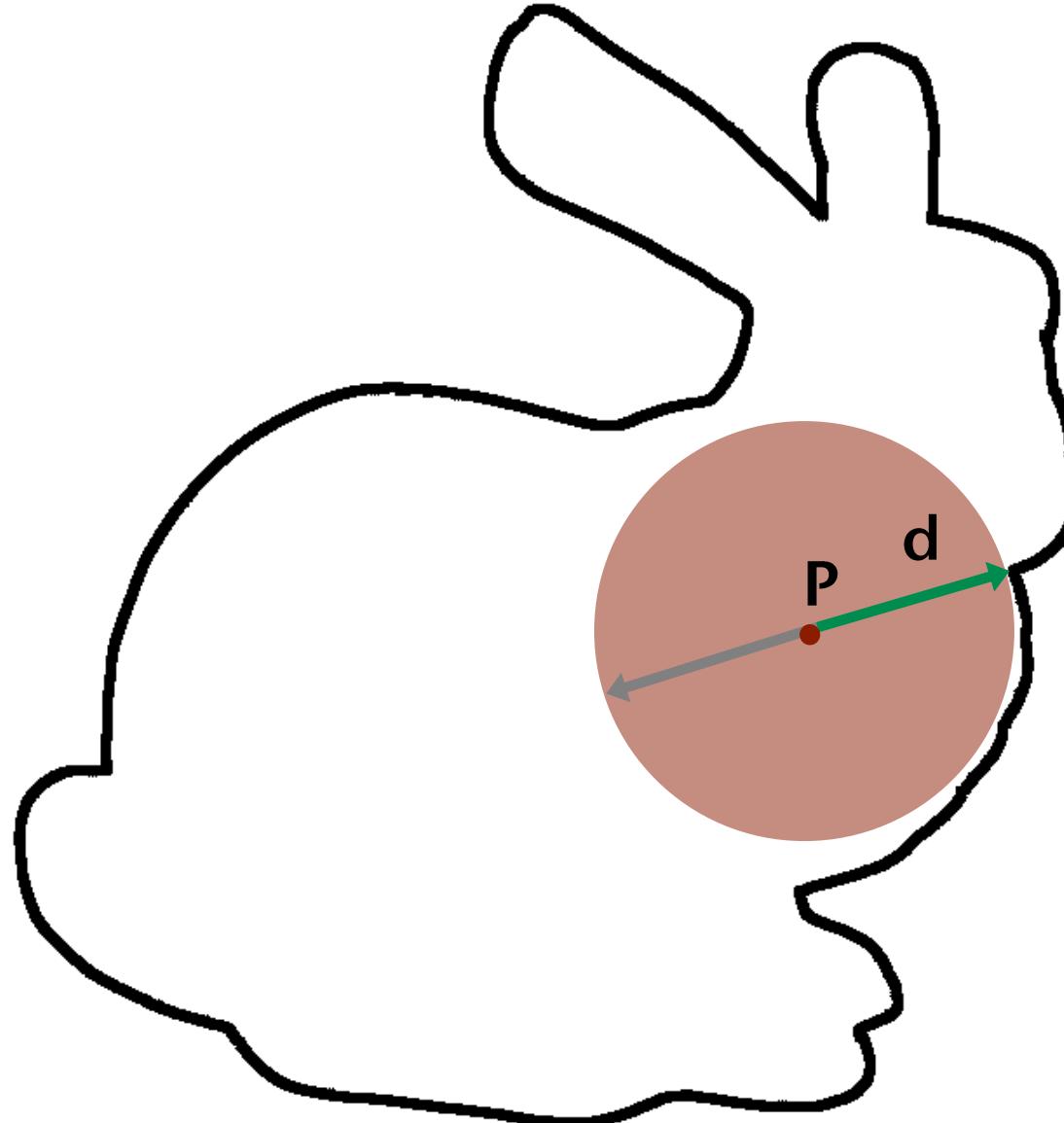
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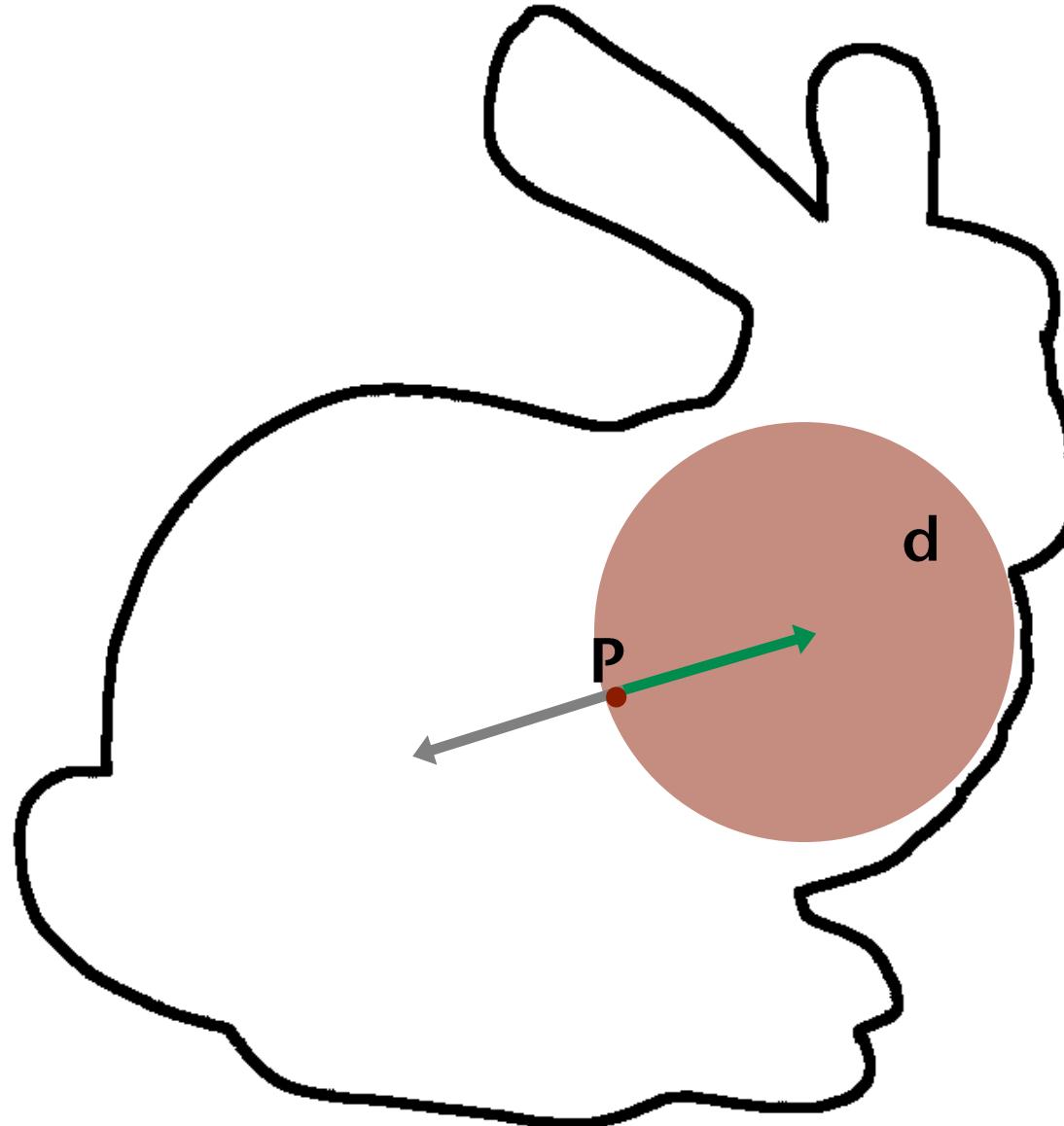
# Protosphere - Basic Algorithm



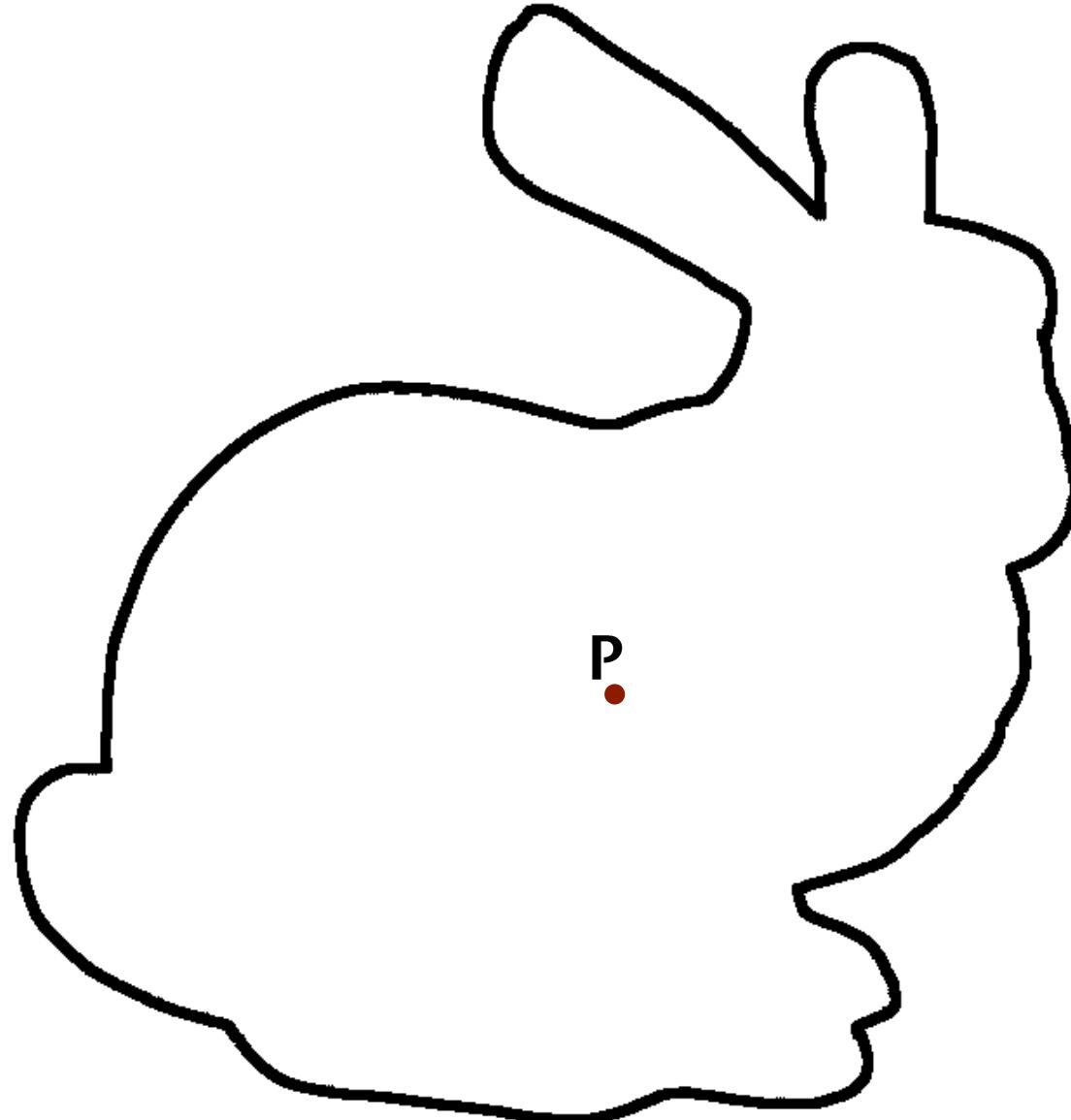
# Protosphere - Basic Algorithm



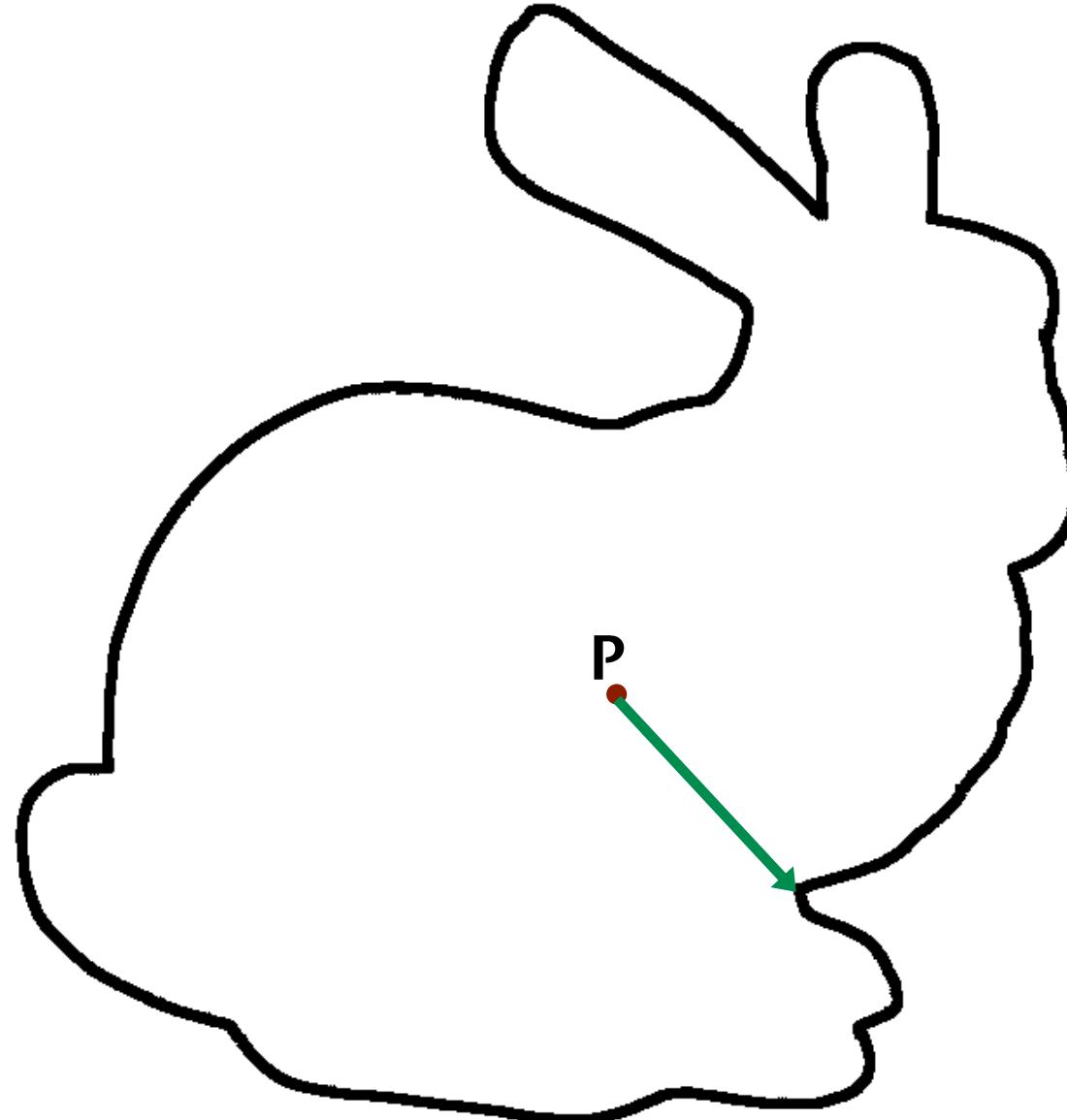
# Protosphere - Basic Algorithm



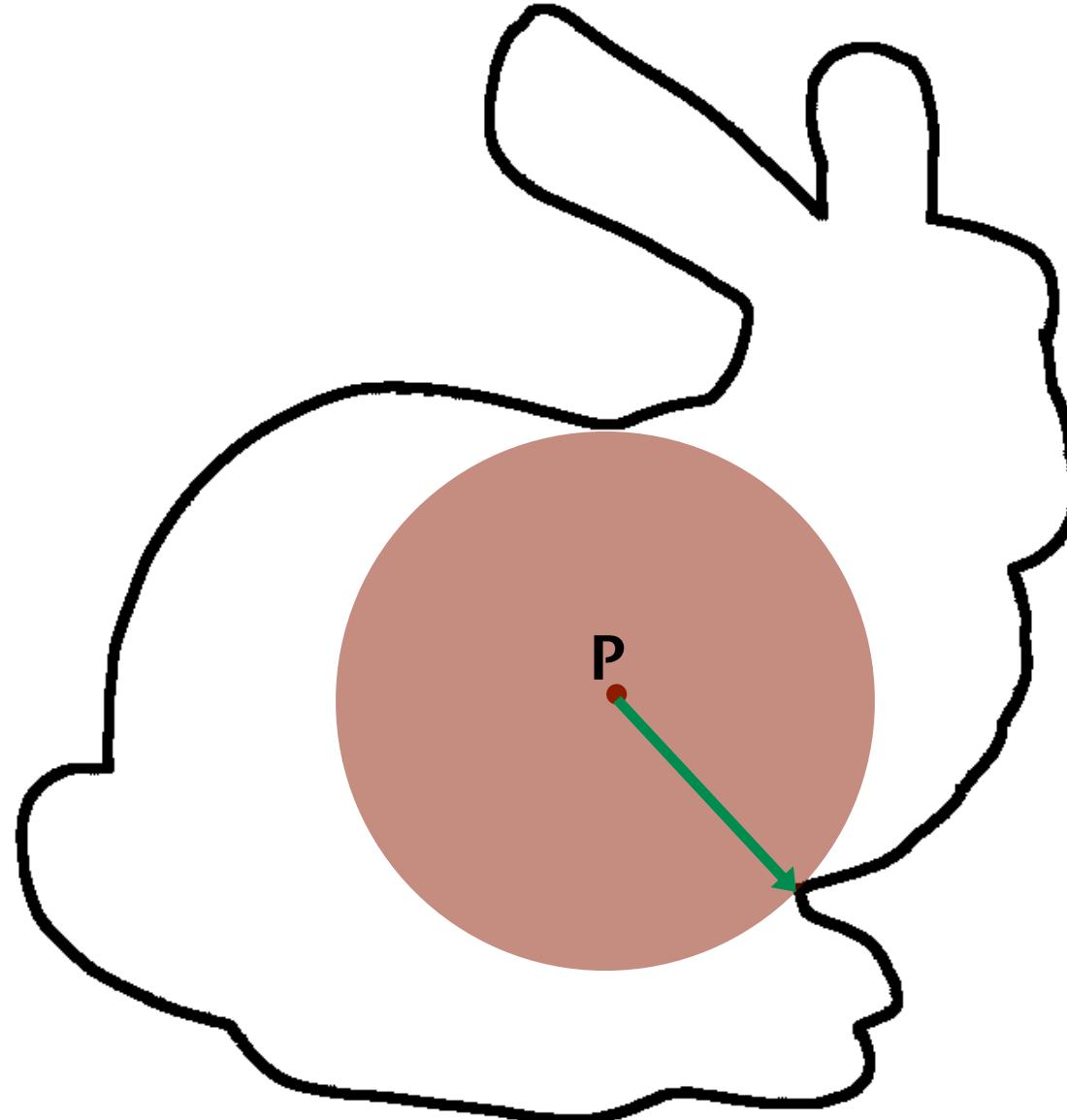
# Protosphere - Basic Algorithm



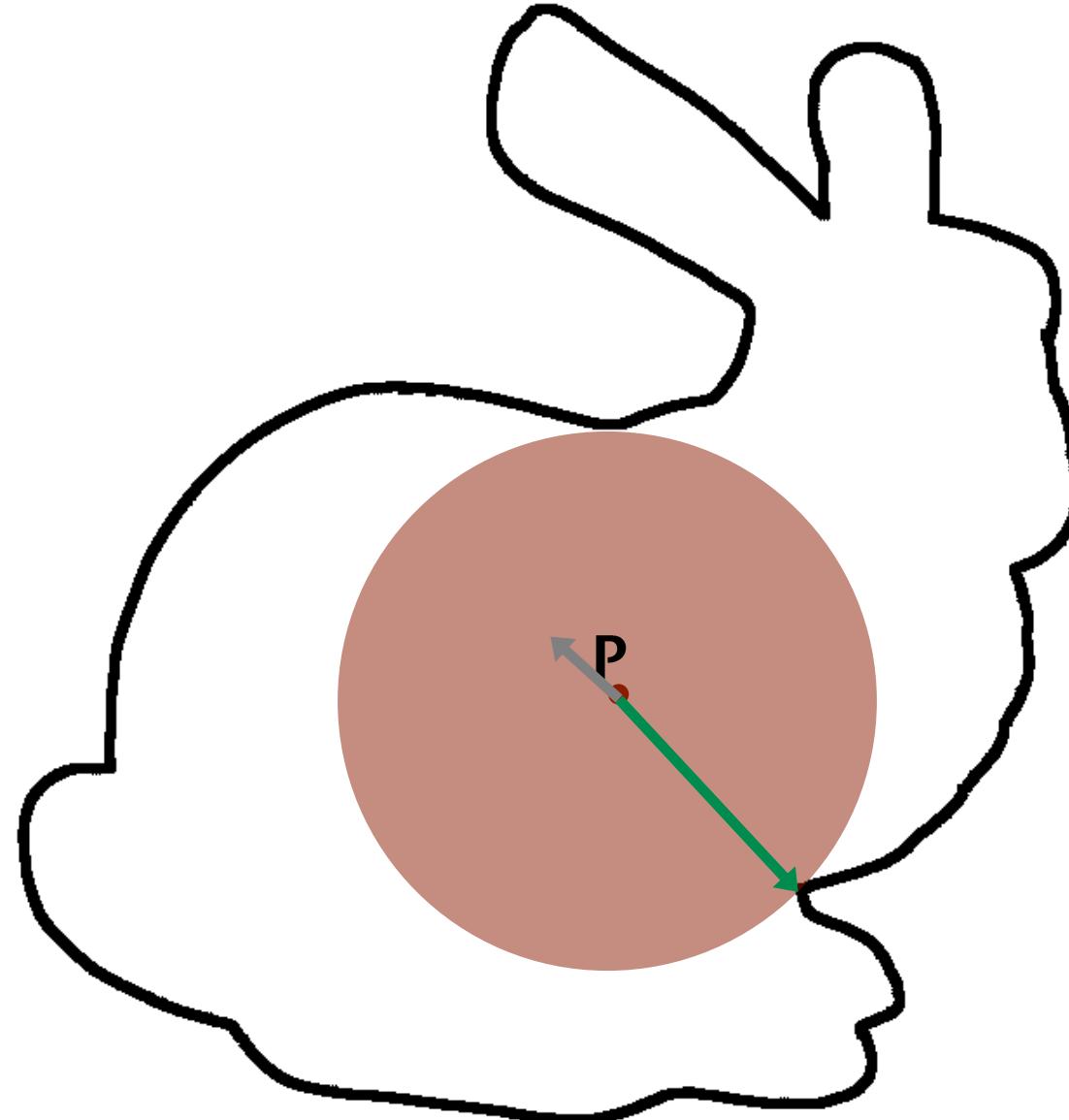
# Protosphere - Basic Algorithm



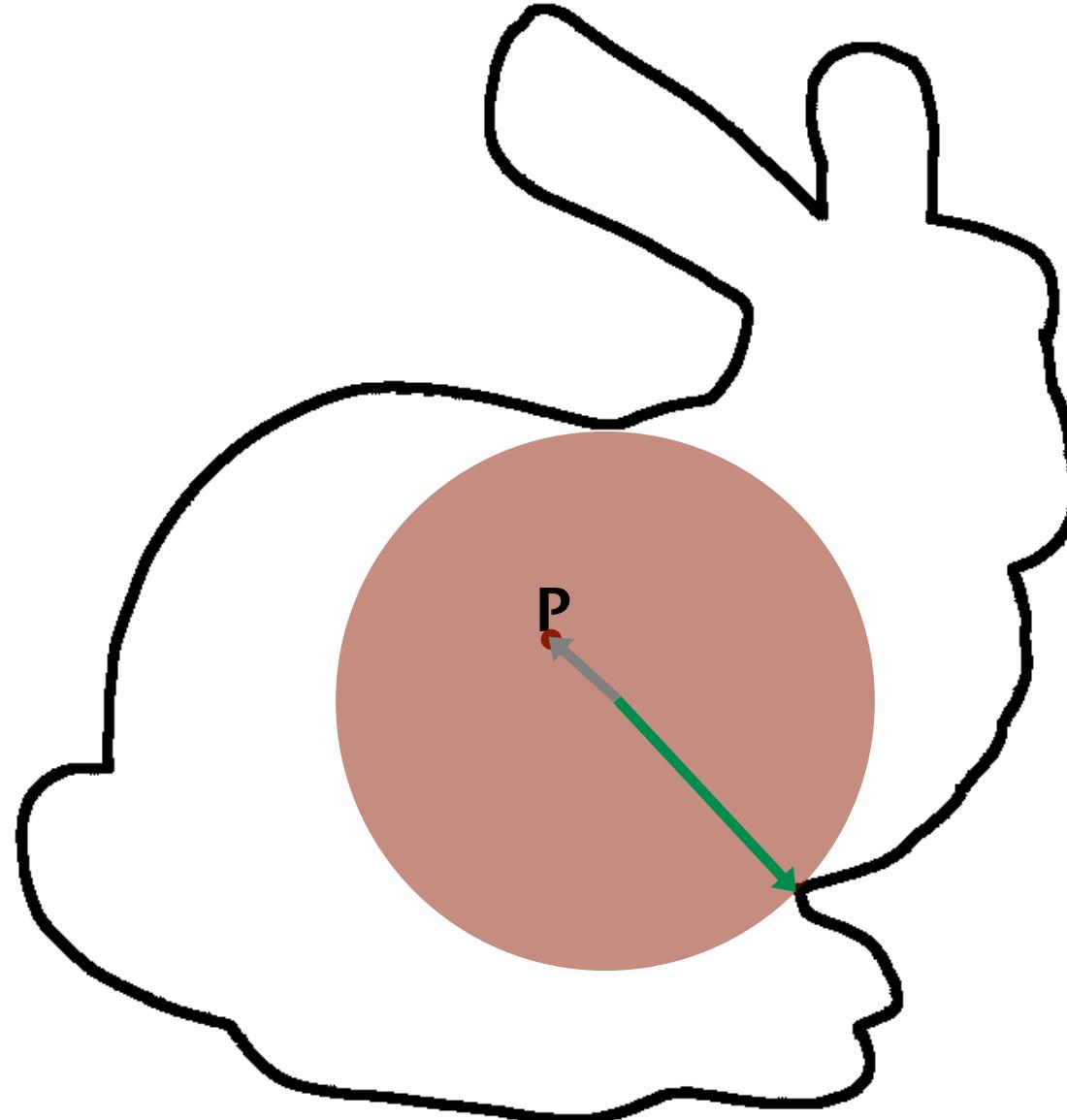
# Protosphere - Basic Algorithm



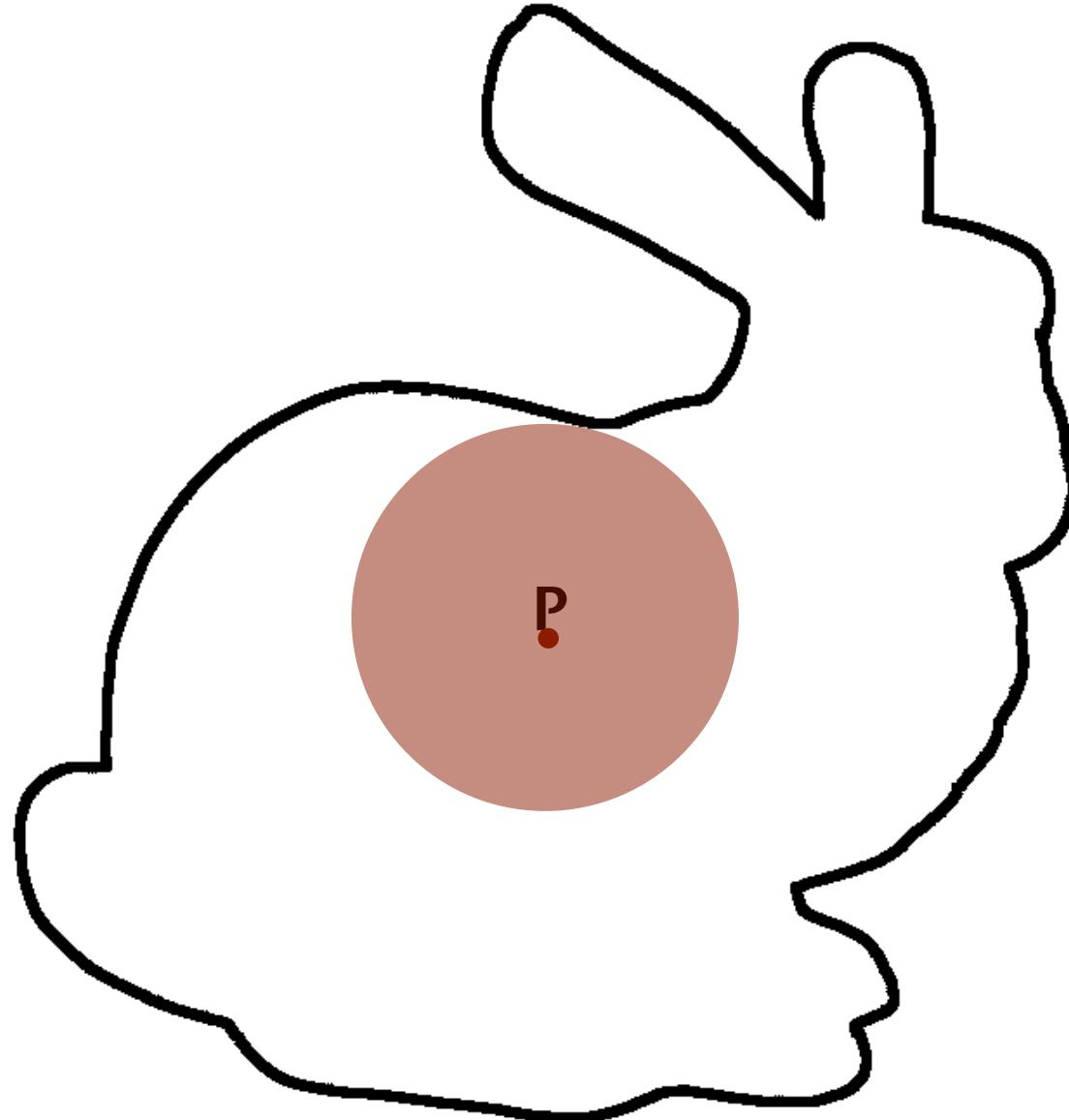
# Protosphere - Basic Algorithm



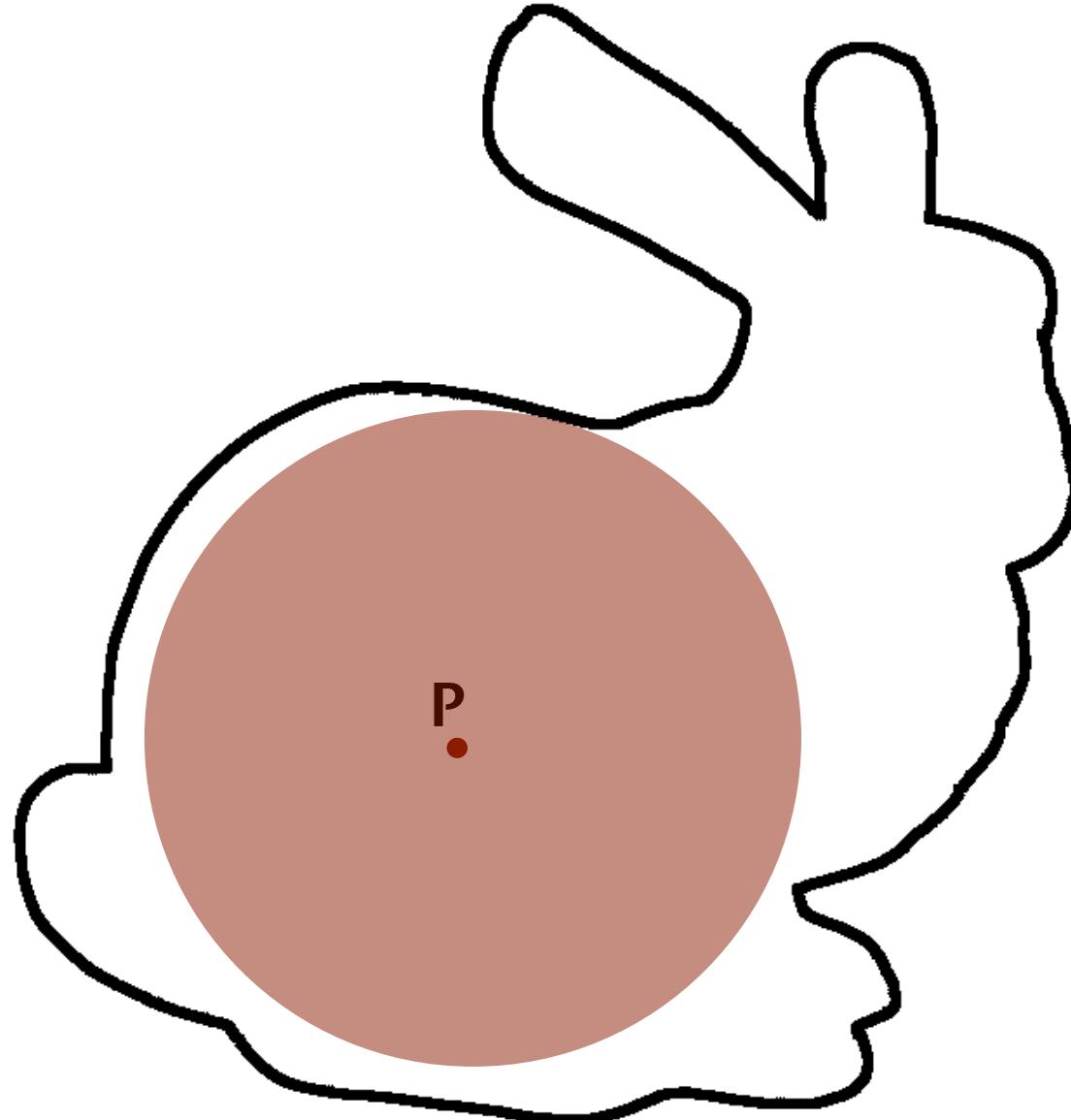
# Protosphere - Basic Algorithm



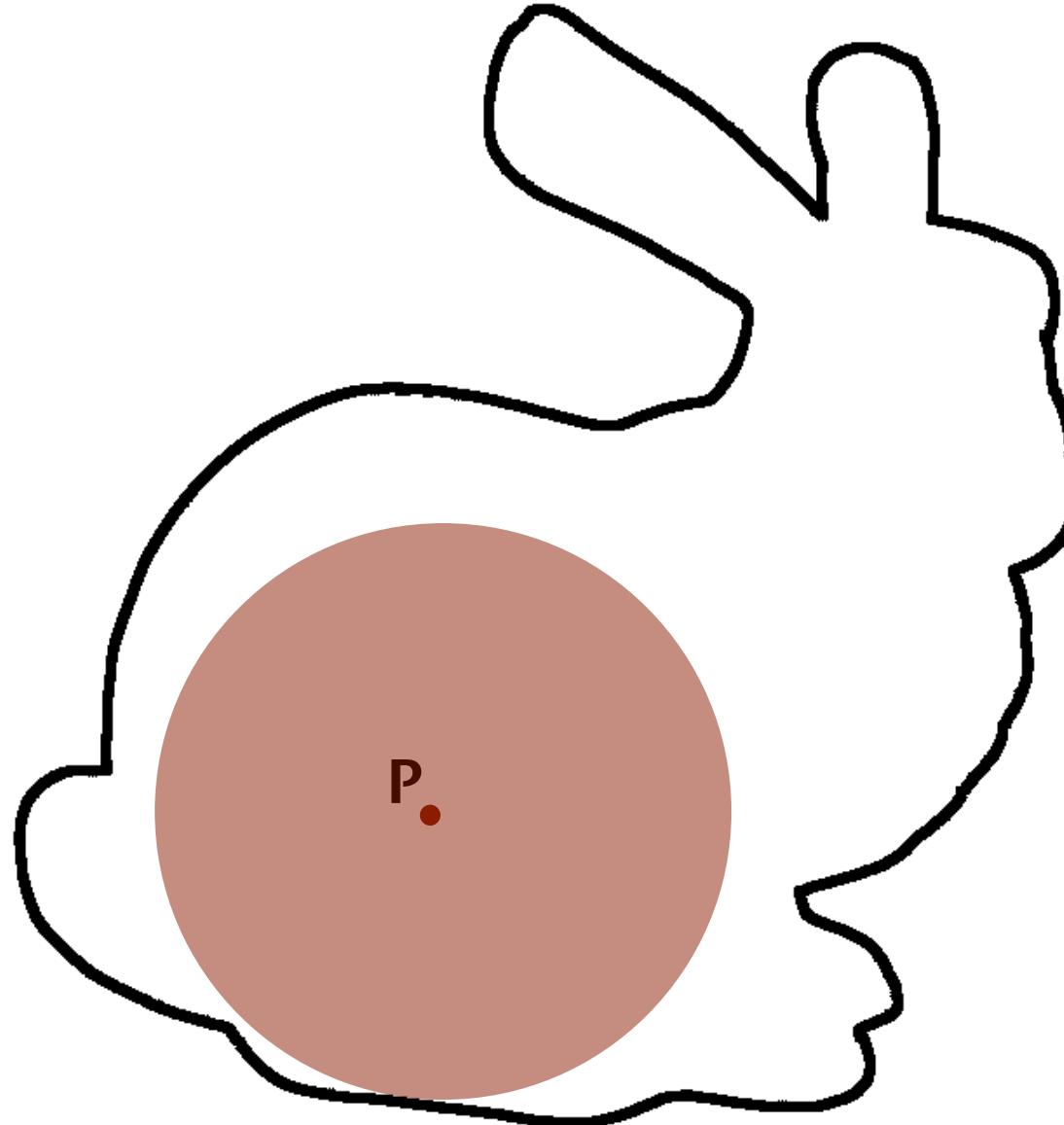
# Protosphere - Basic Algorithm



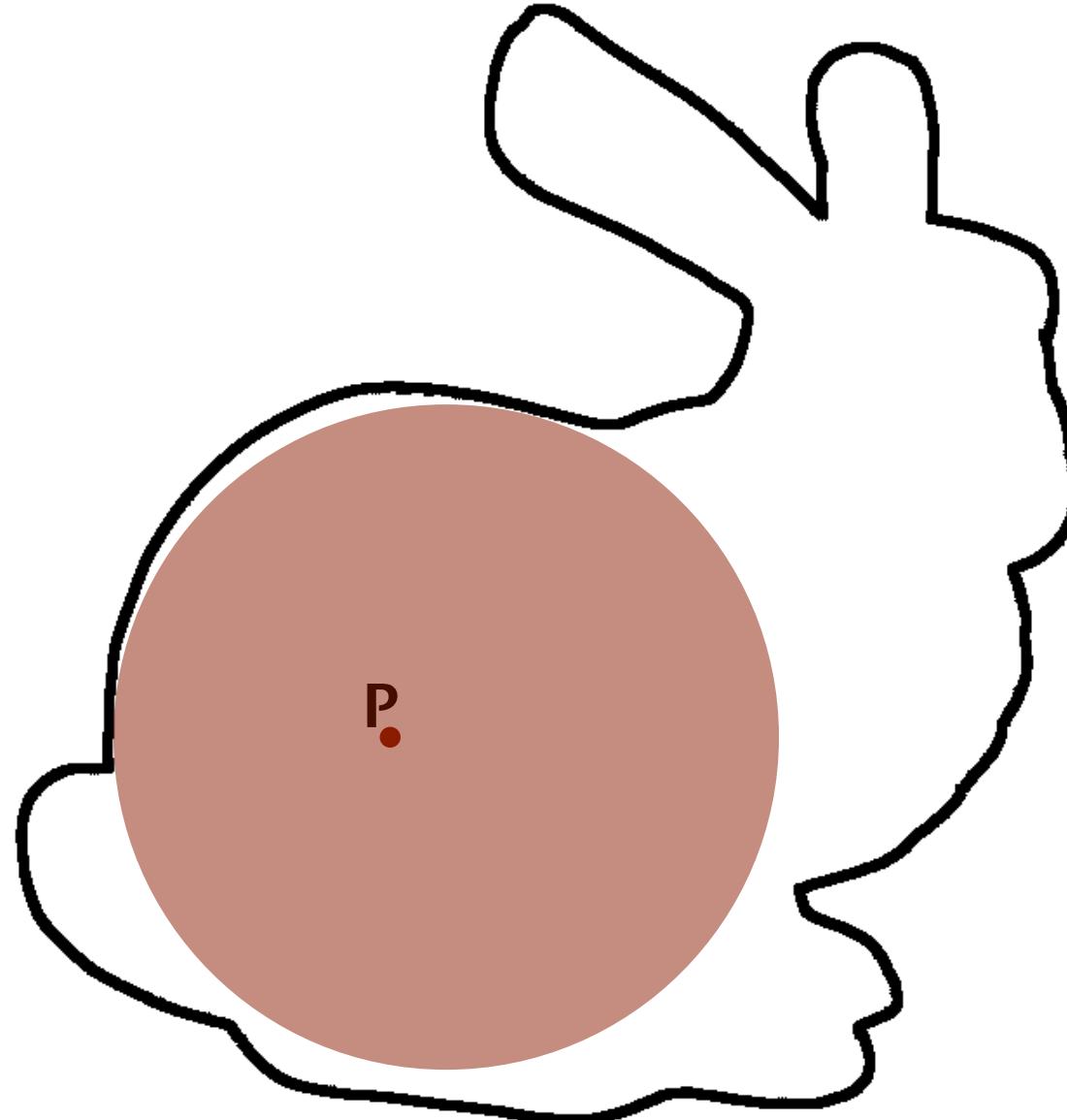
# Protosphere - Basic Algorithm



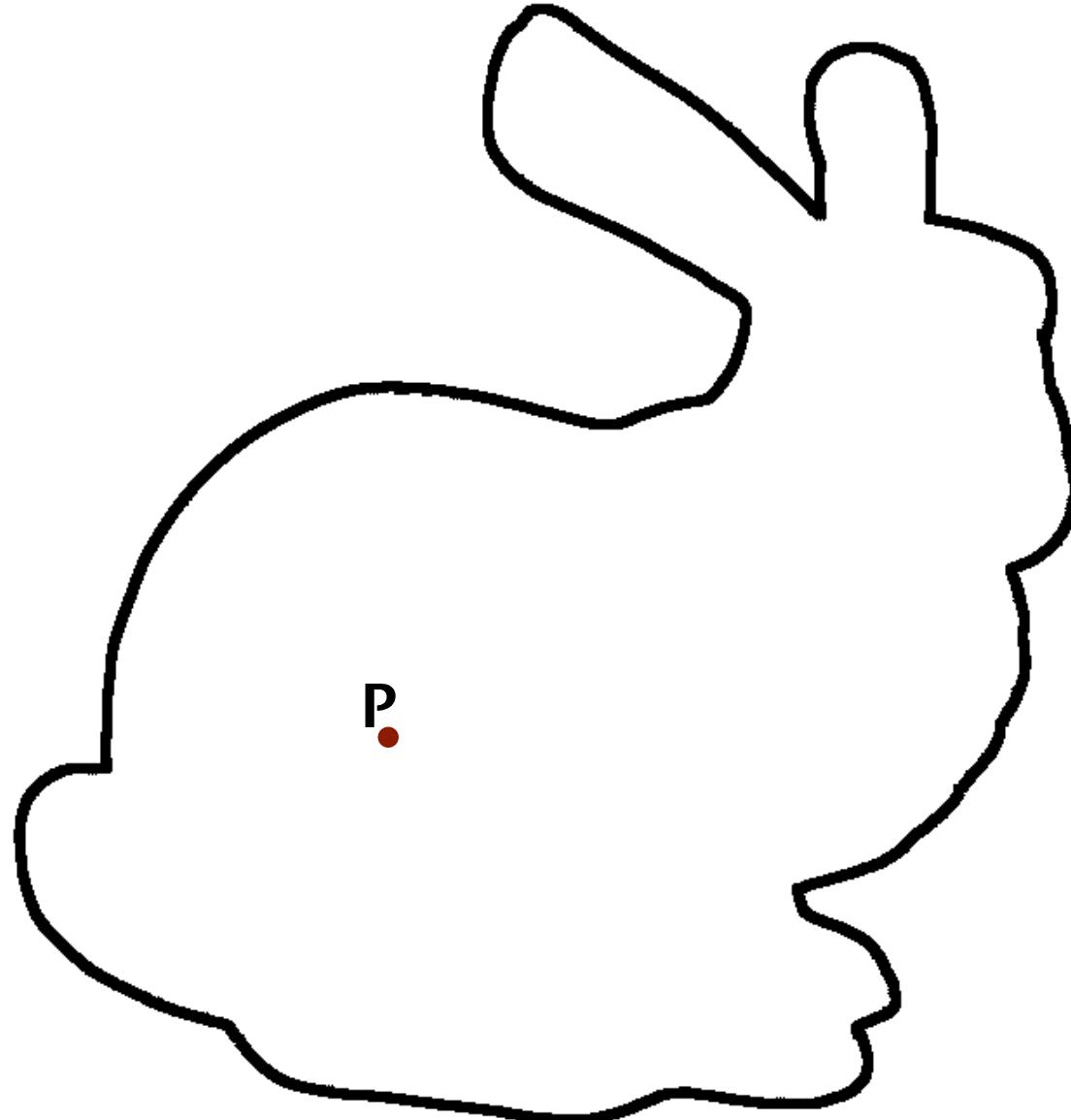
# Protosphere - Basic Algorithm



# Protosphere - Basic Algorithm



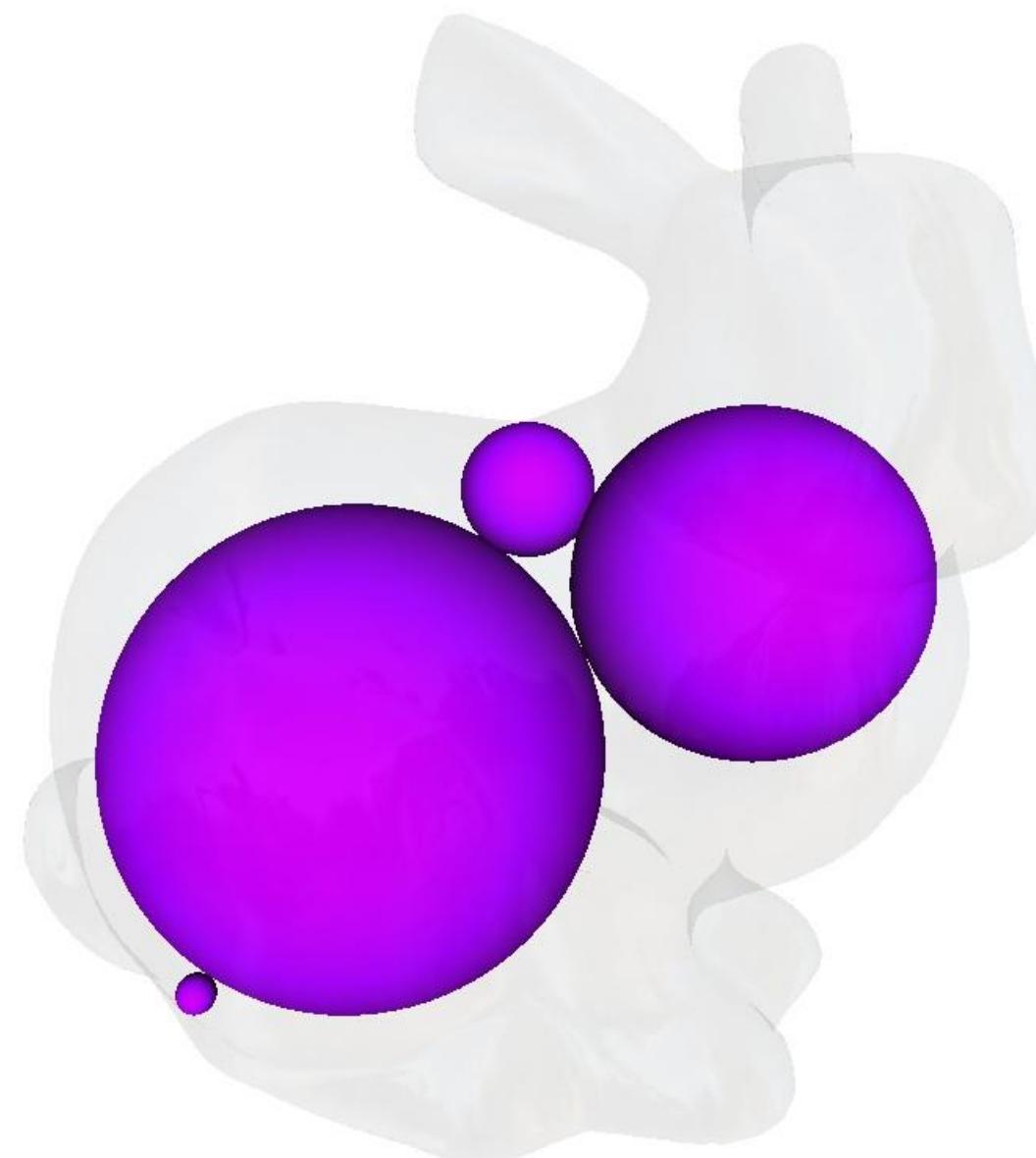
# Protosphere - Basic Algorithm



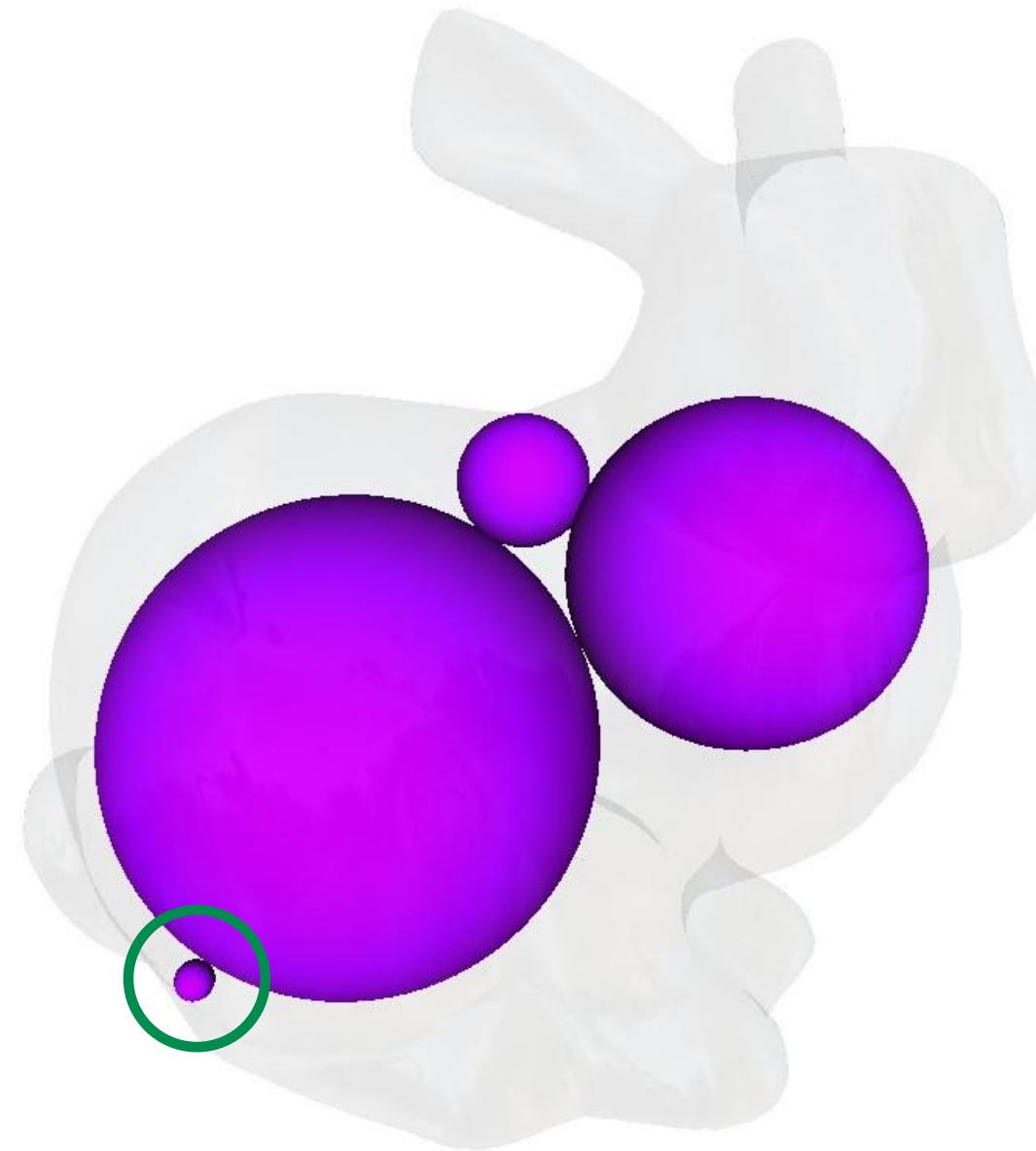
# Protosphere - Basic Algorithm



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# Protosphere - Basic Algorithm



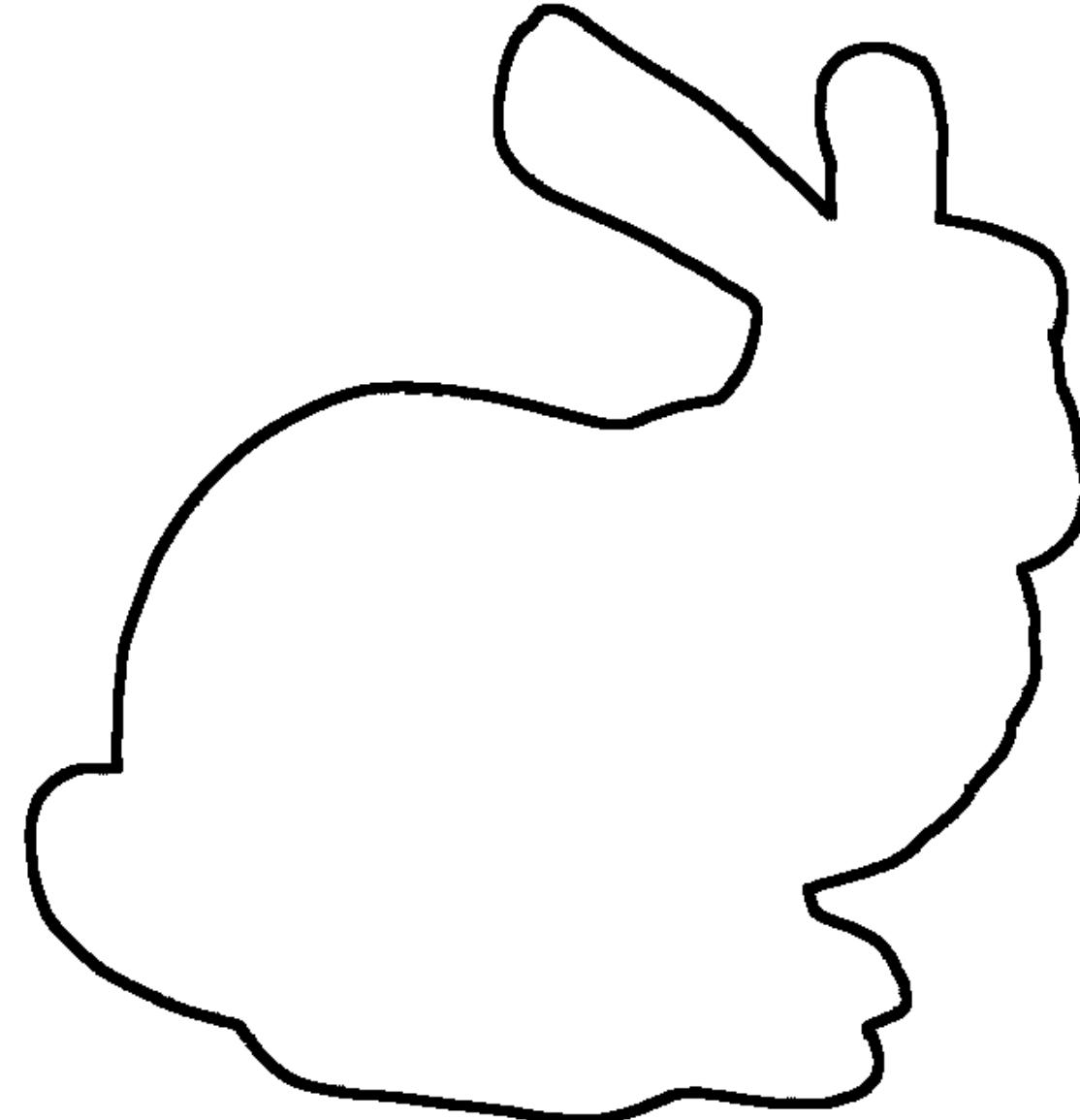
# Protosphere - Basic Algorithm



# Protosphere - Basic Algorithm

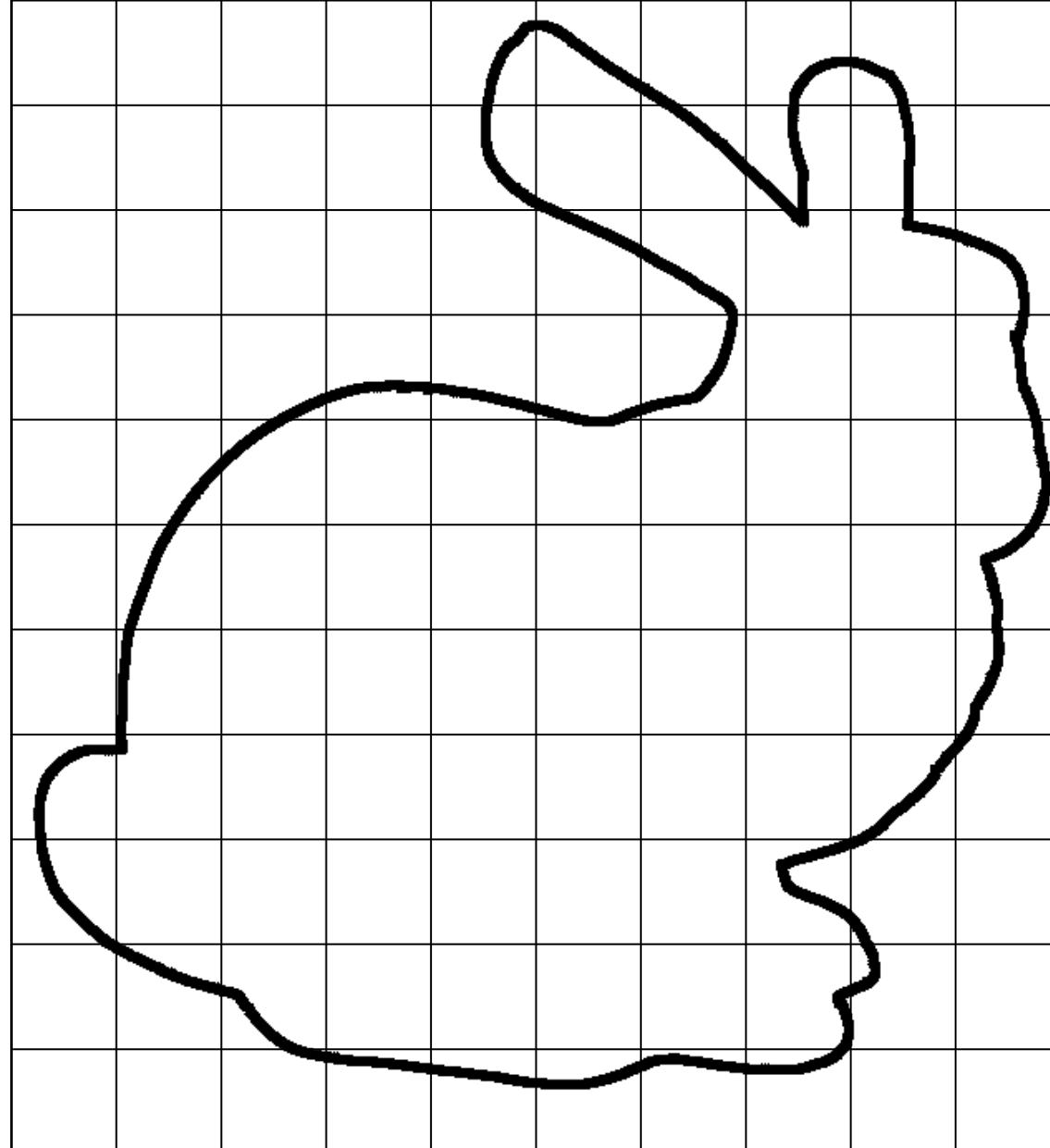


# Parallelization

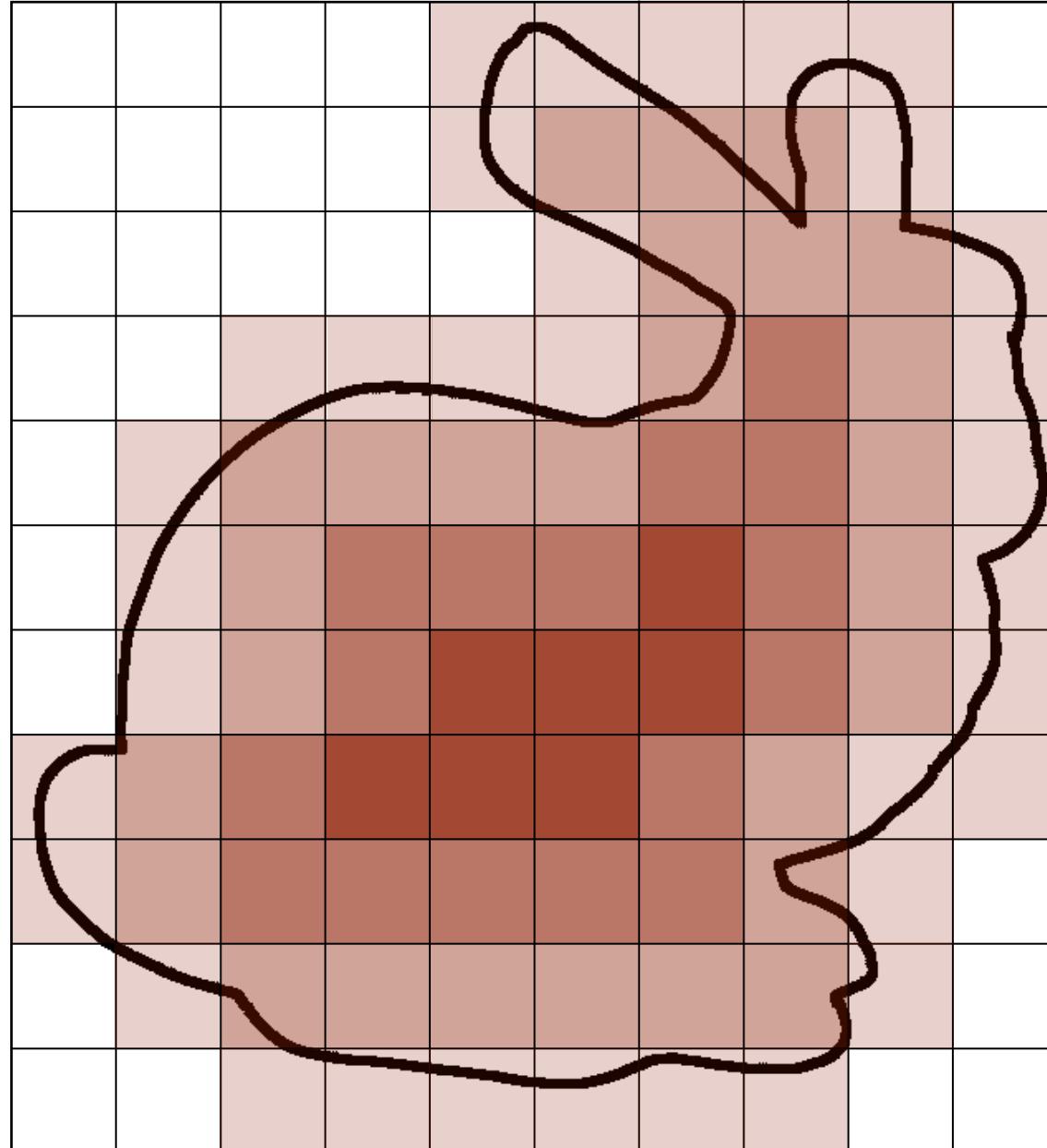




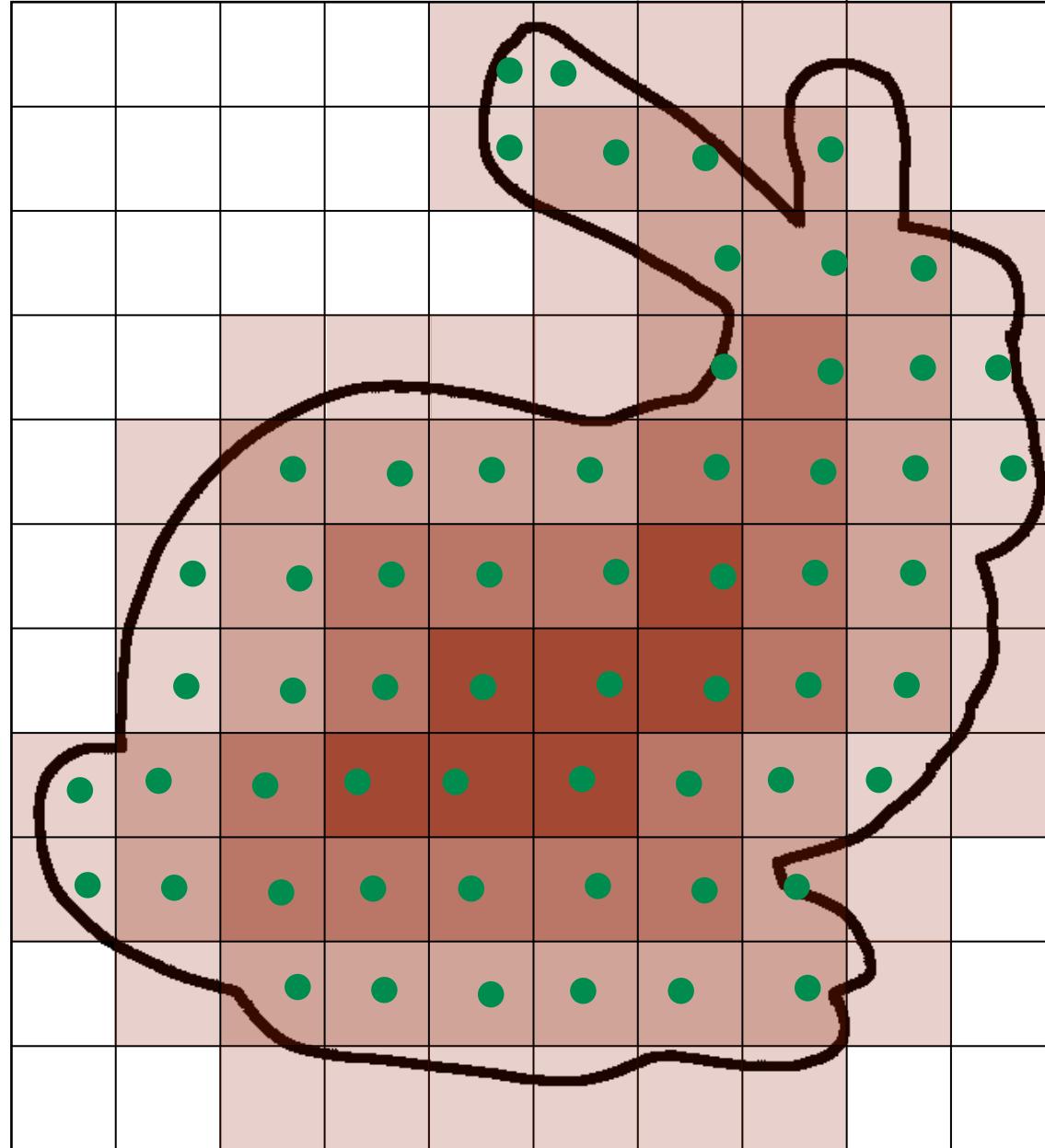
# Parallelization



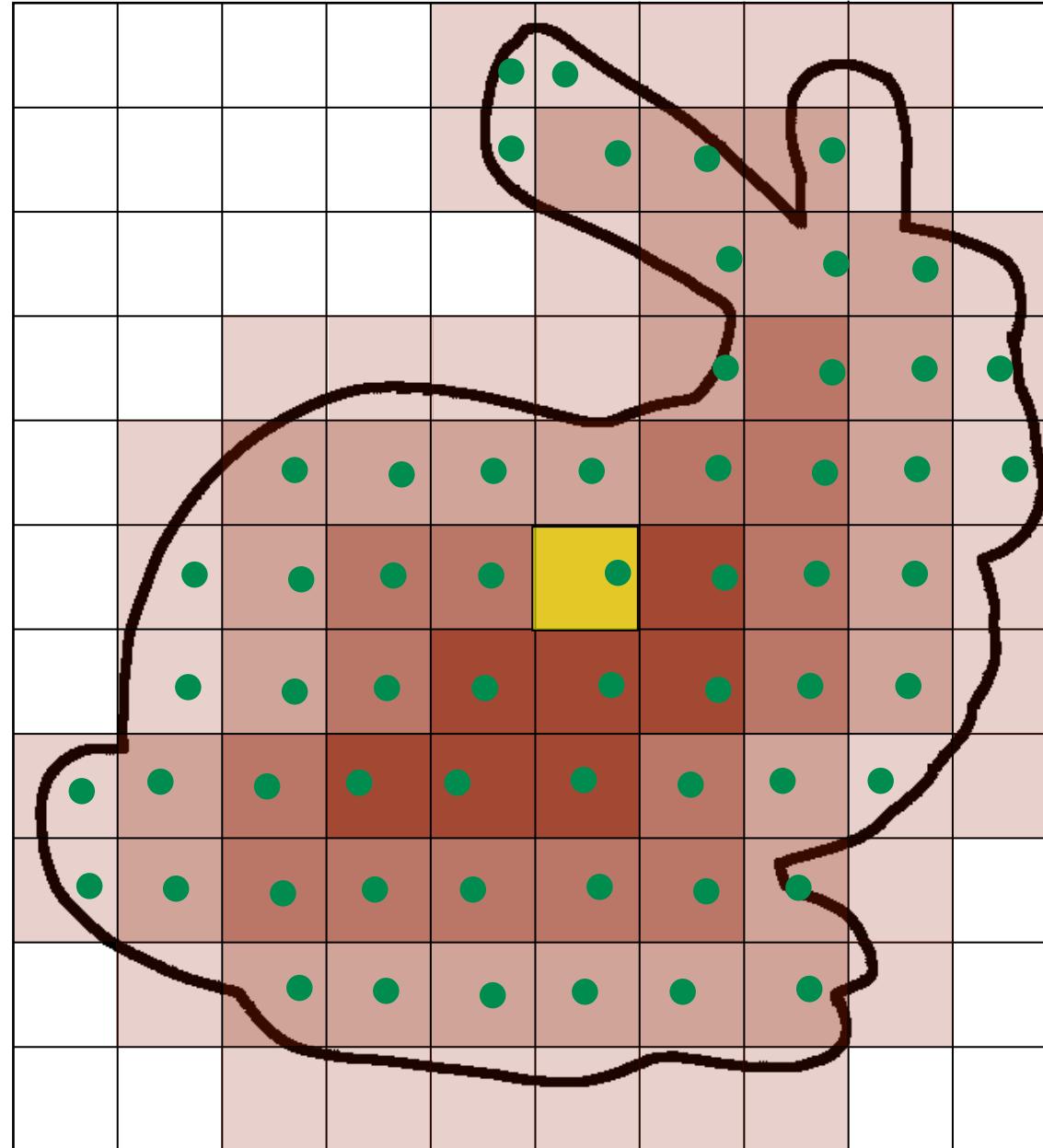
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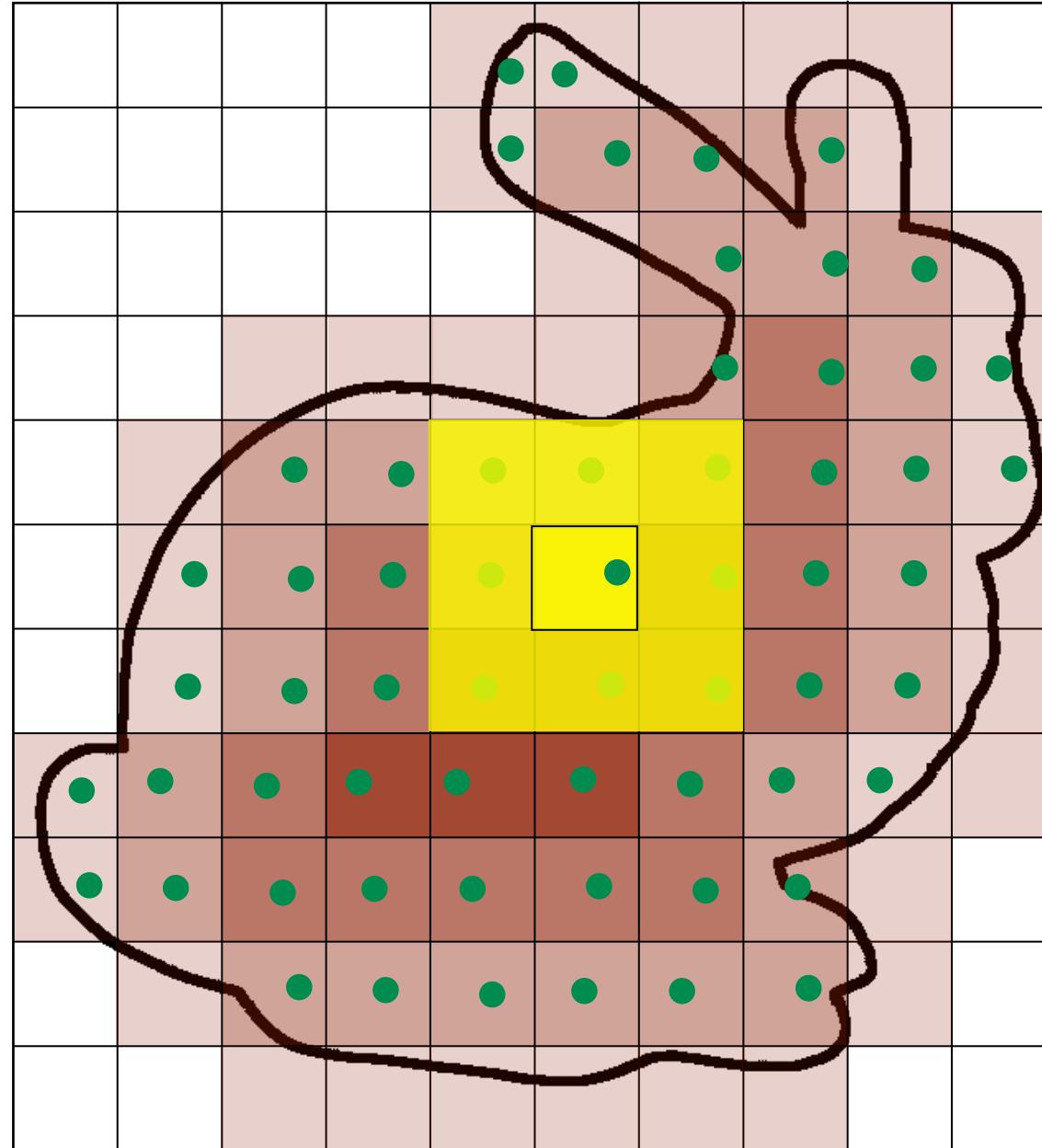
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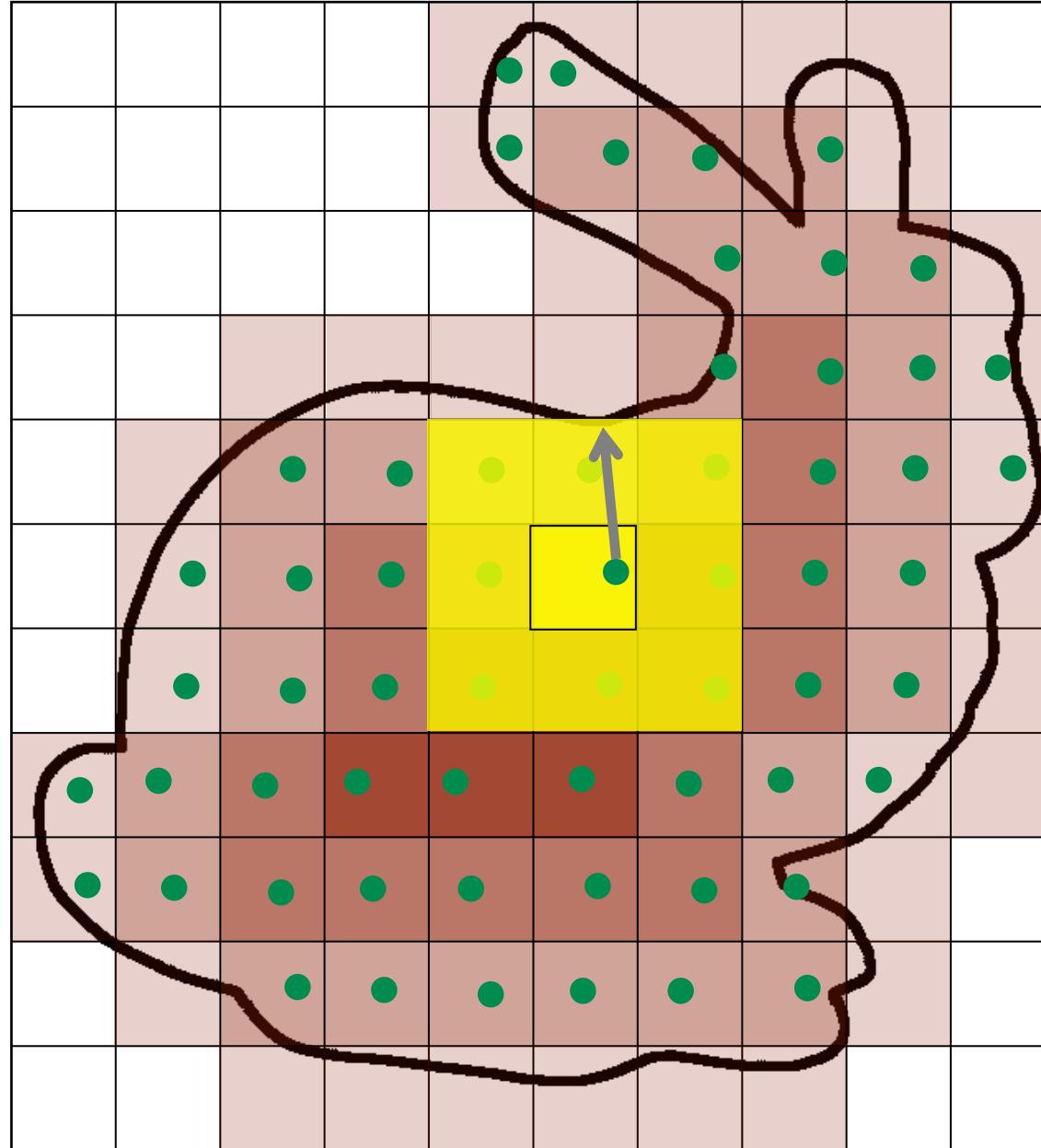
# Parallelization



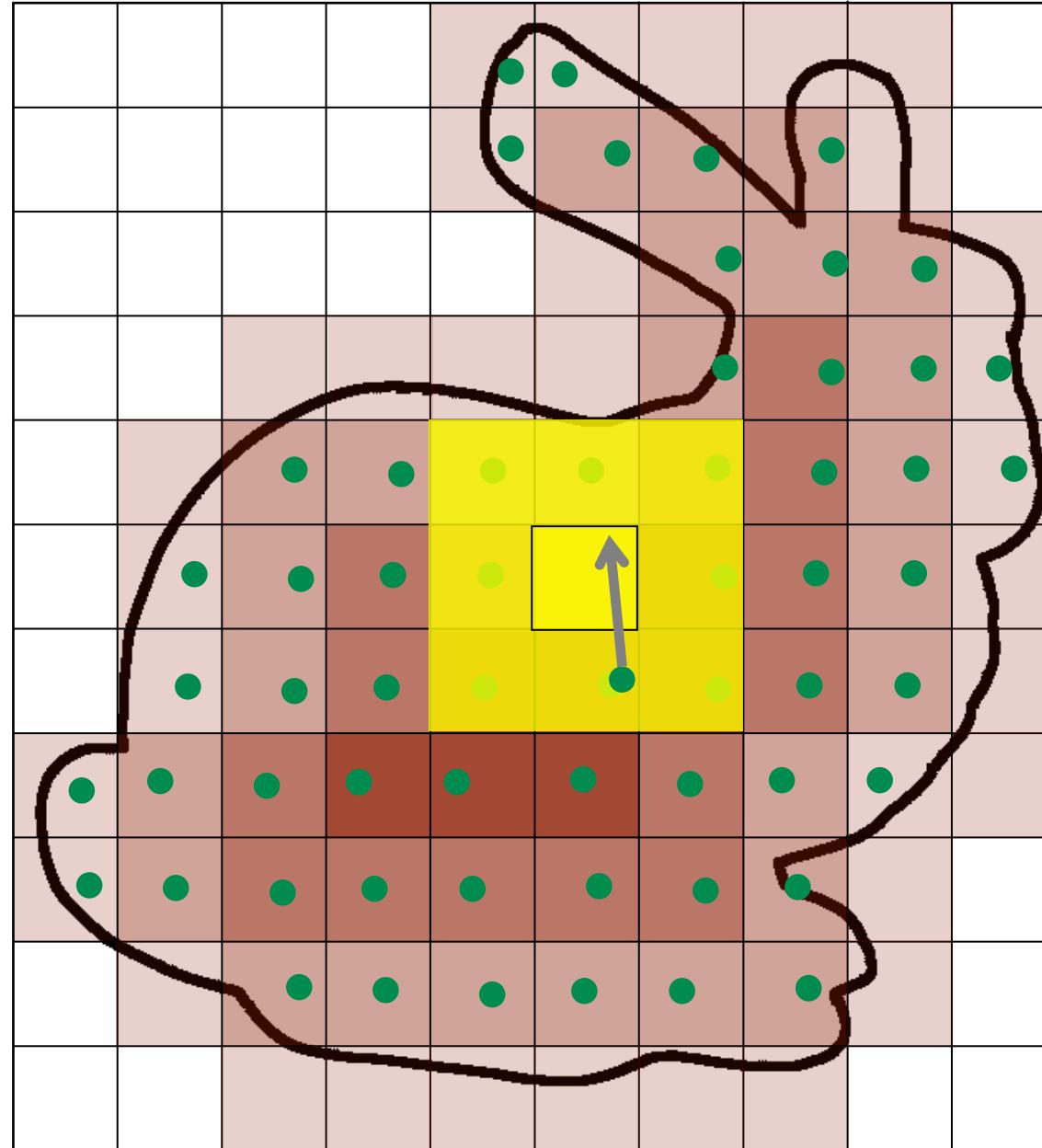
# Parallelization



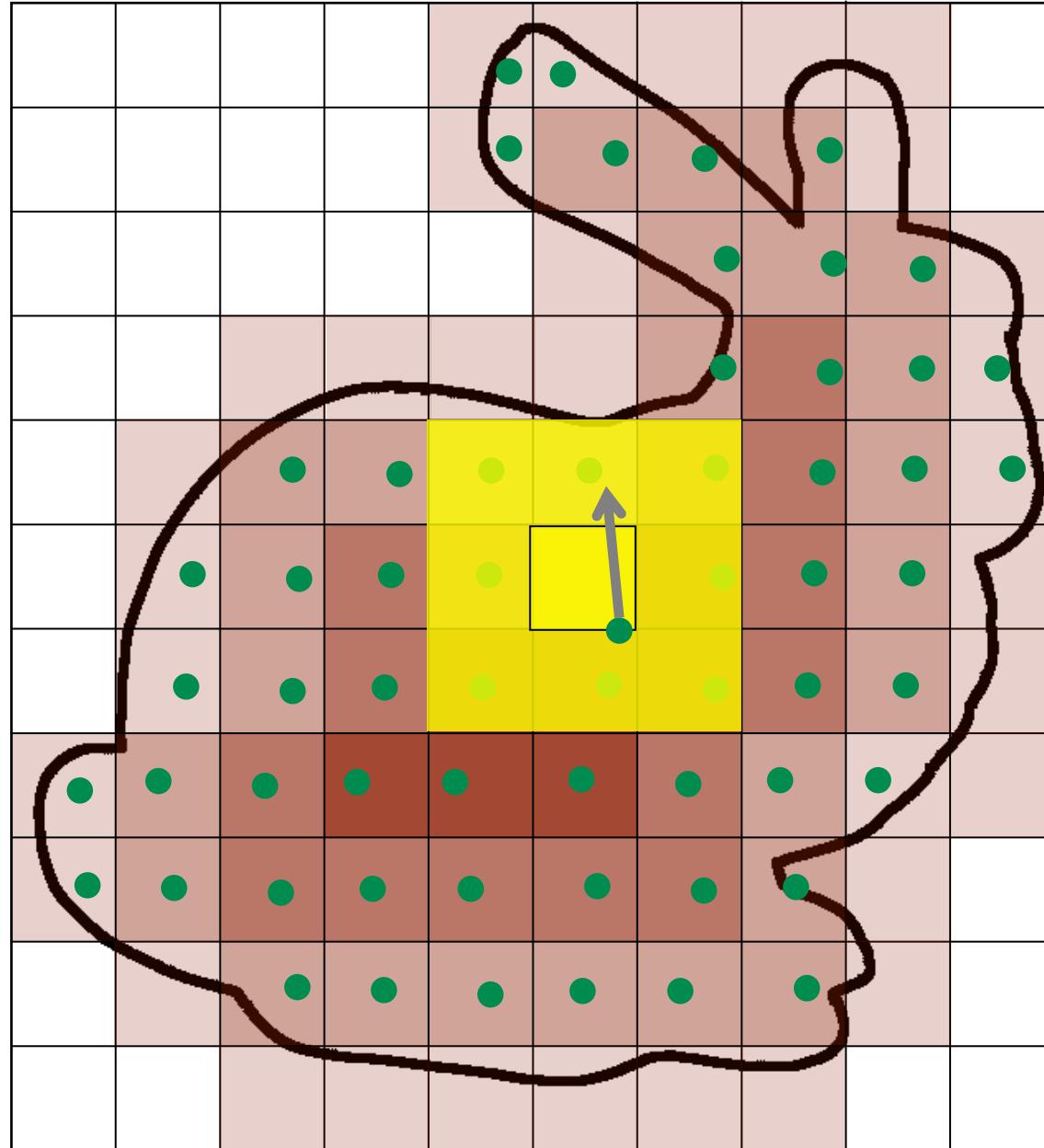
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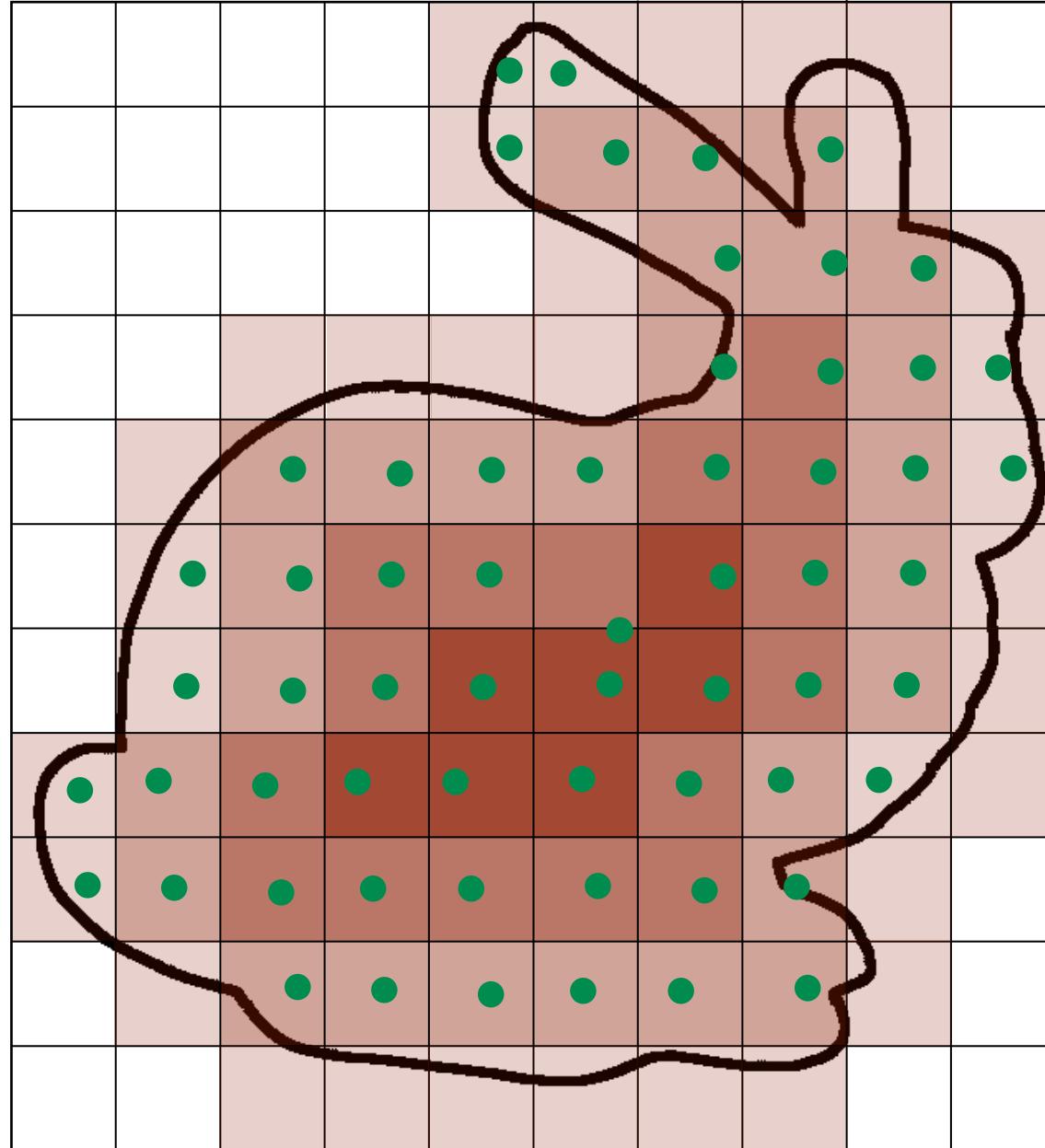
# Parallelization



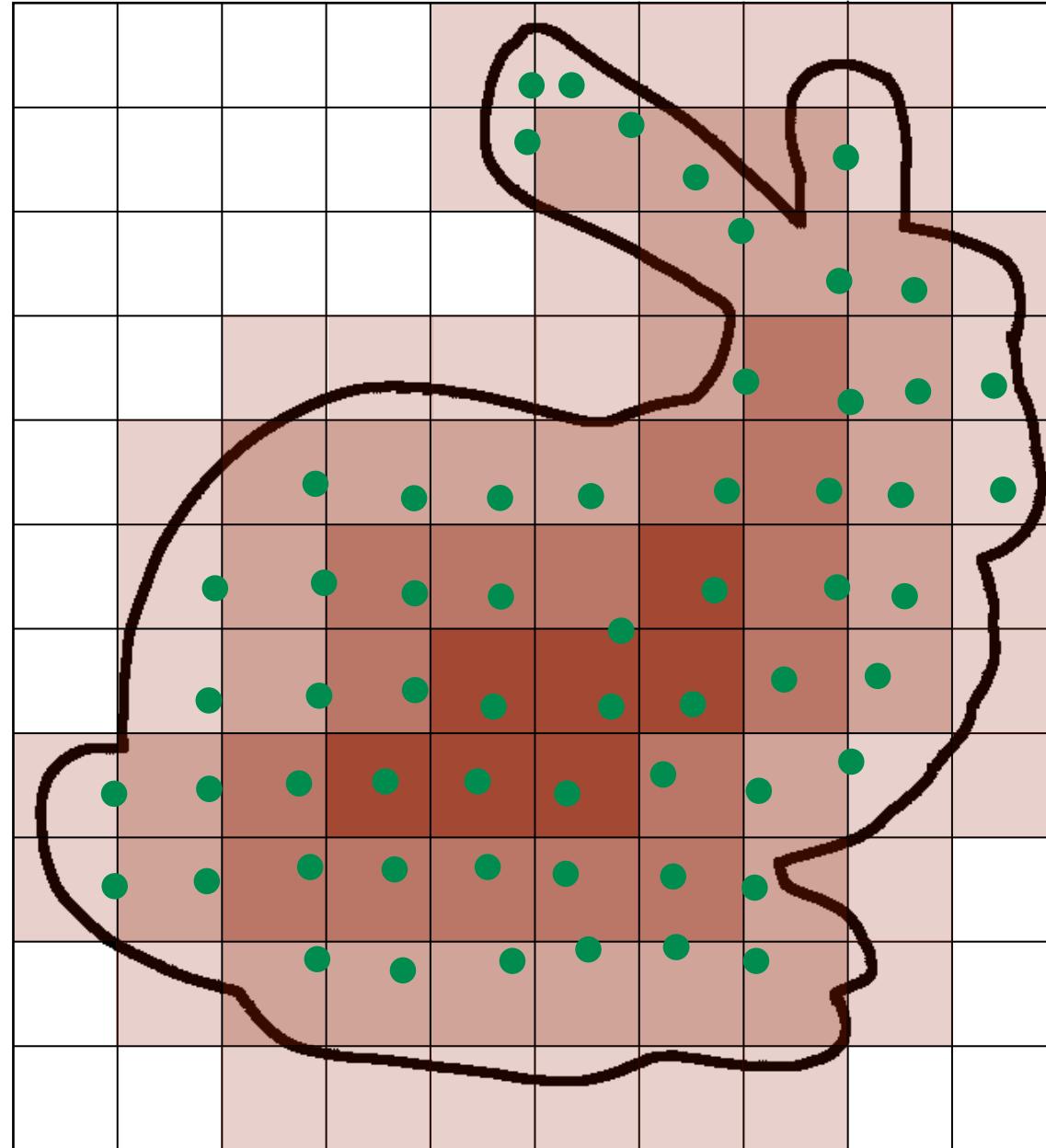
# Parallelization



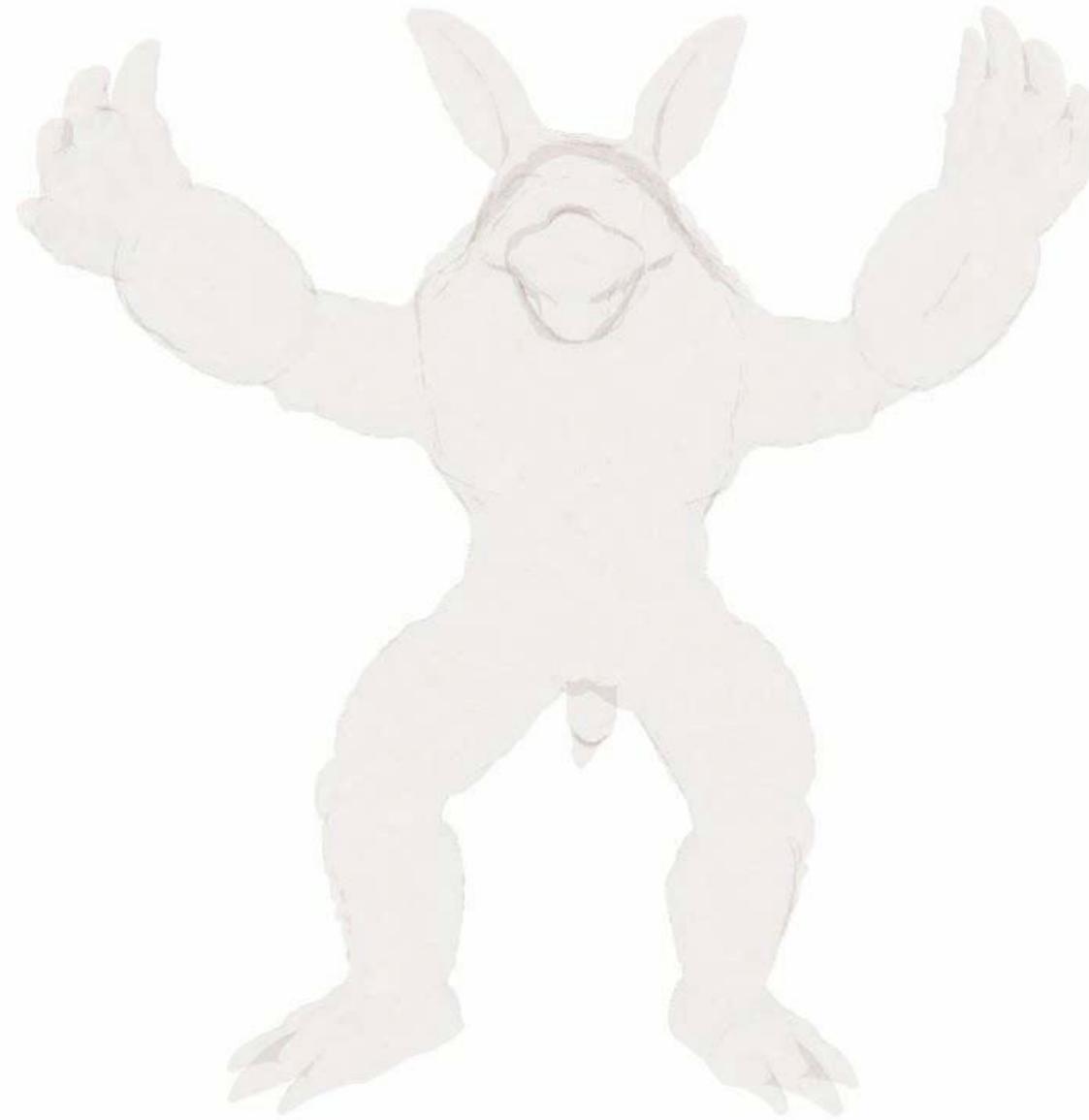
# Parallelization



# Parallelization



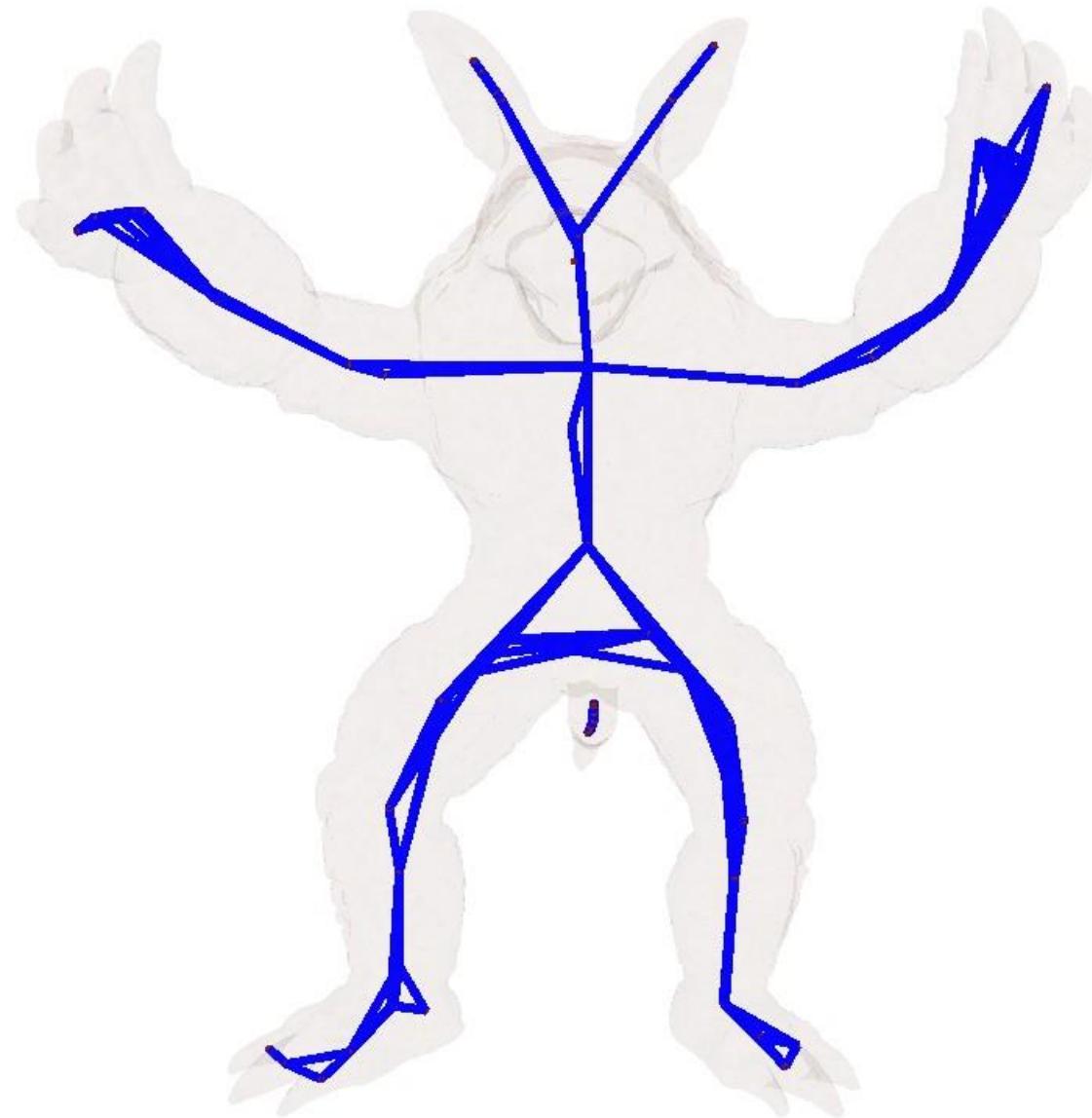
# Parallel Protosphere



# Parallel Protosphere



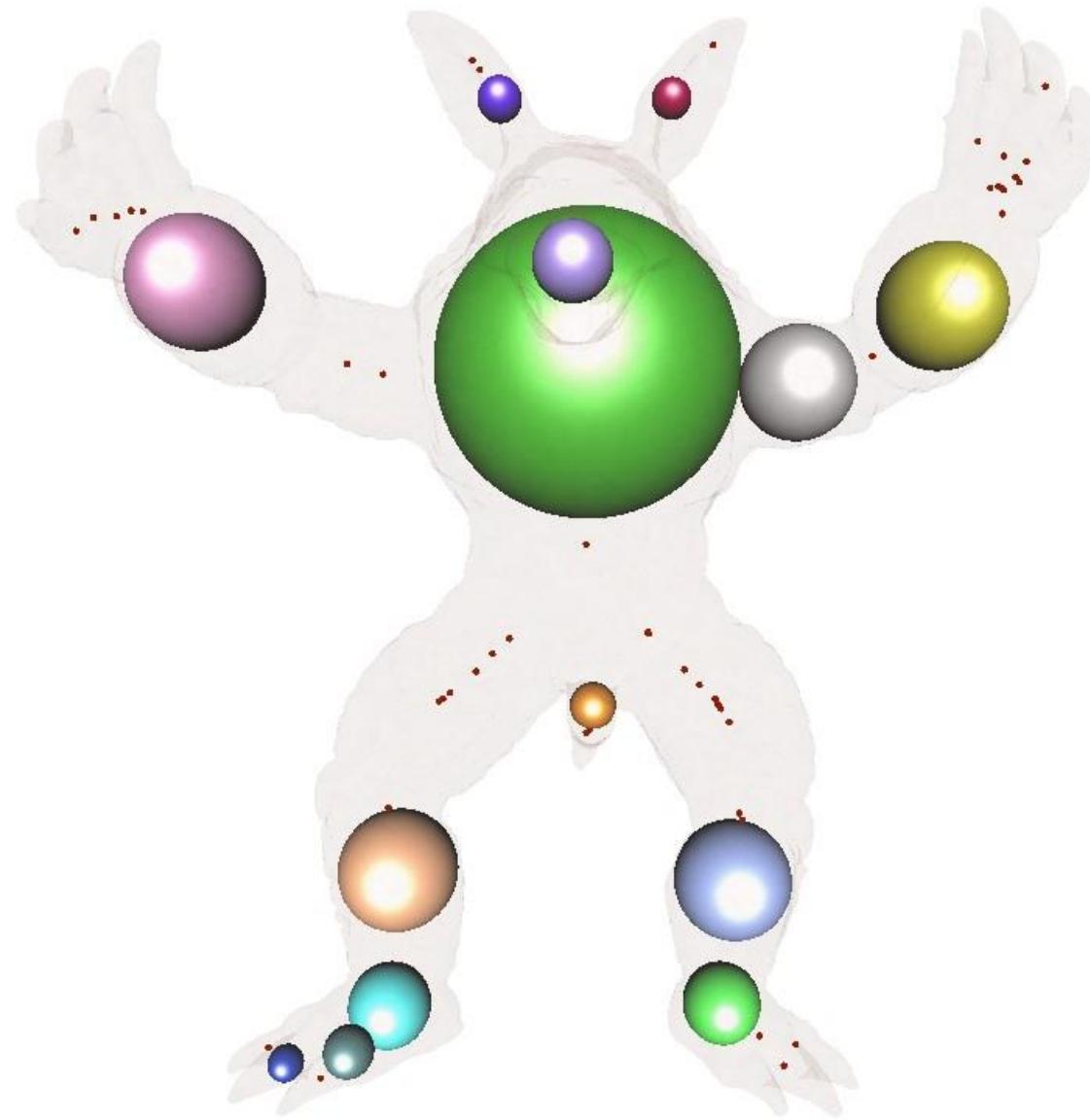
# Parallel Protosphere



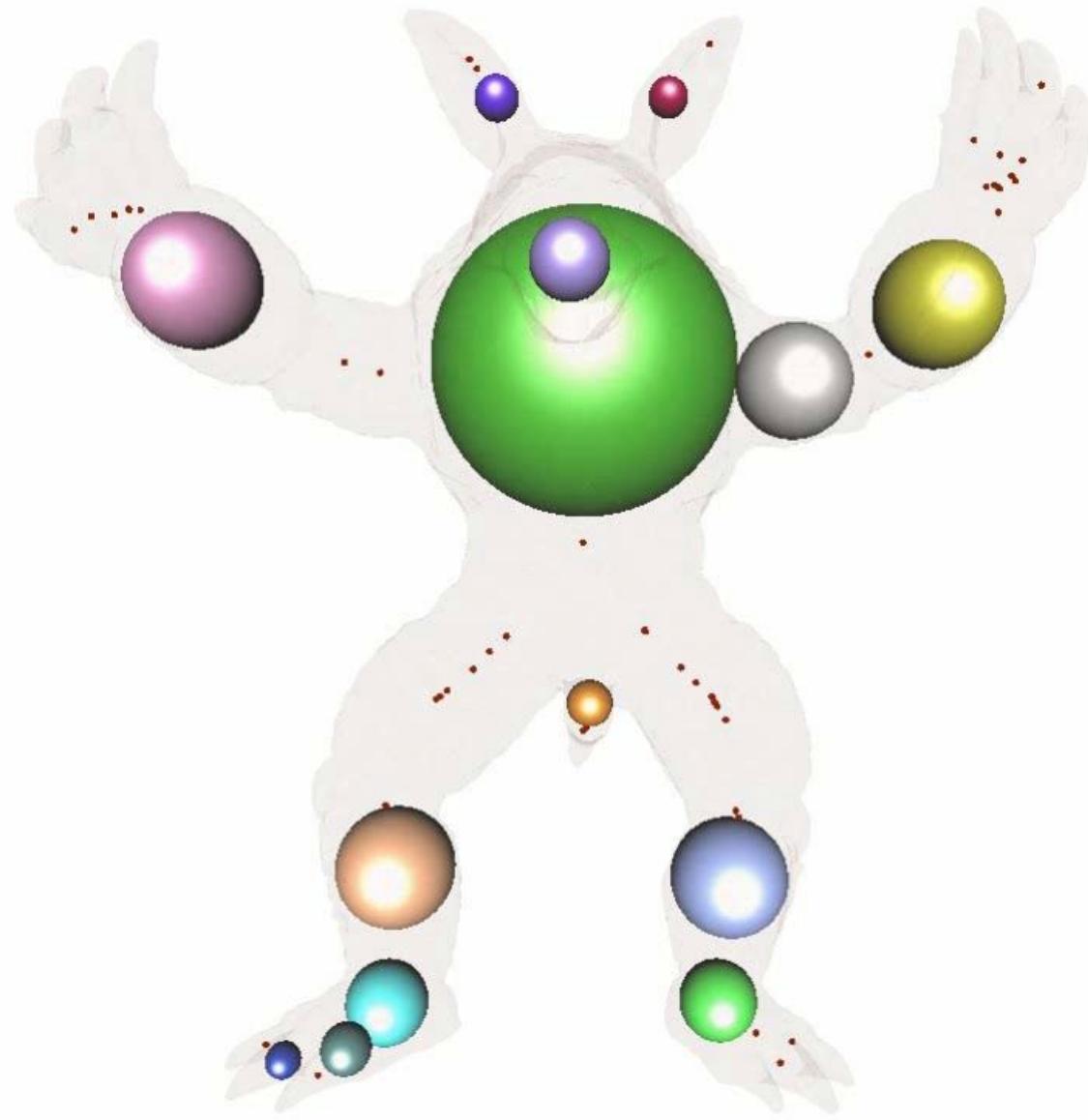
# Parallel Protosphere



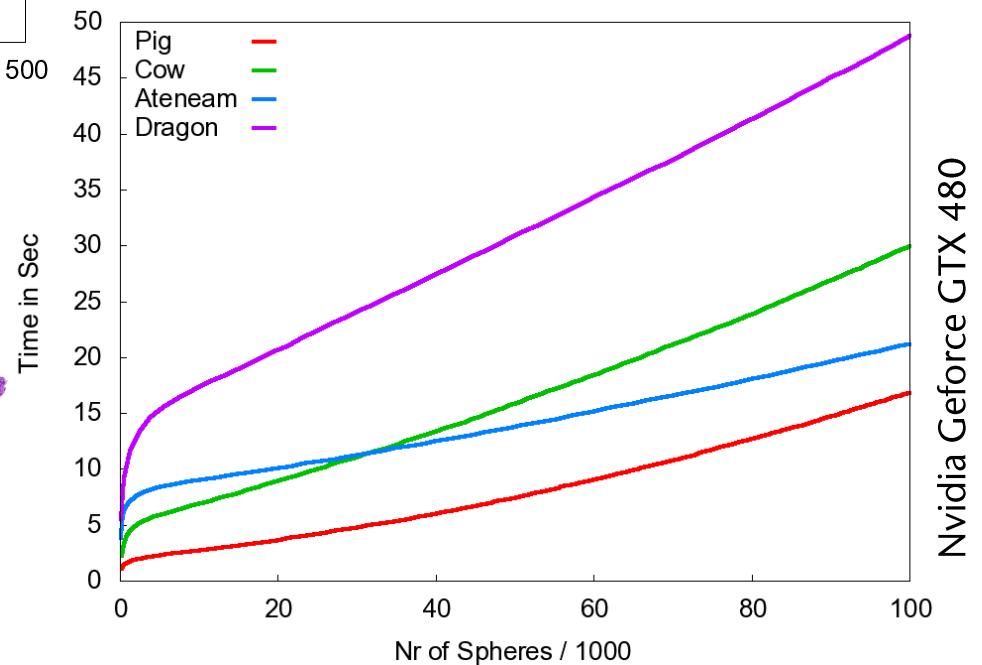
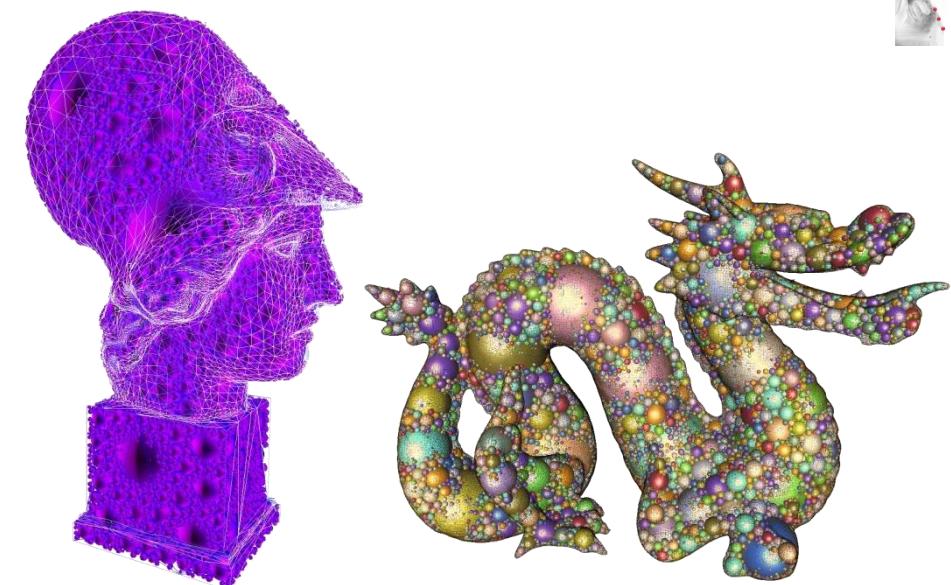
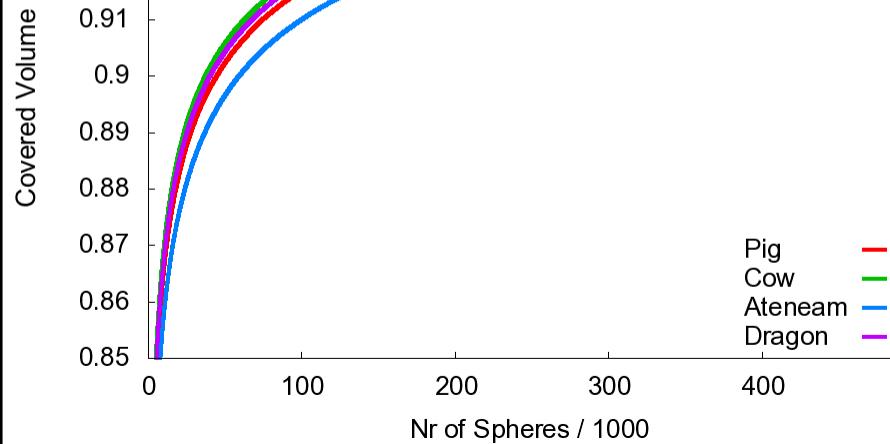
# Parallel Protosphere



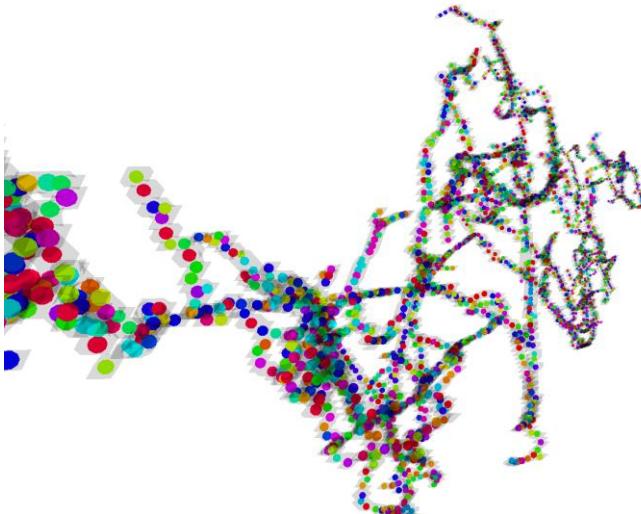
# Parallel Protosphere



# Results



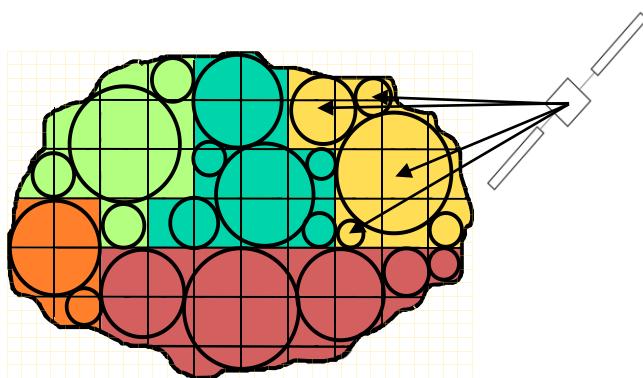
# Further Applications of our Sphere Packings



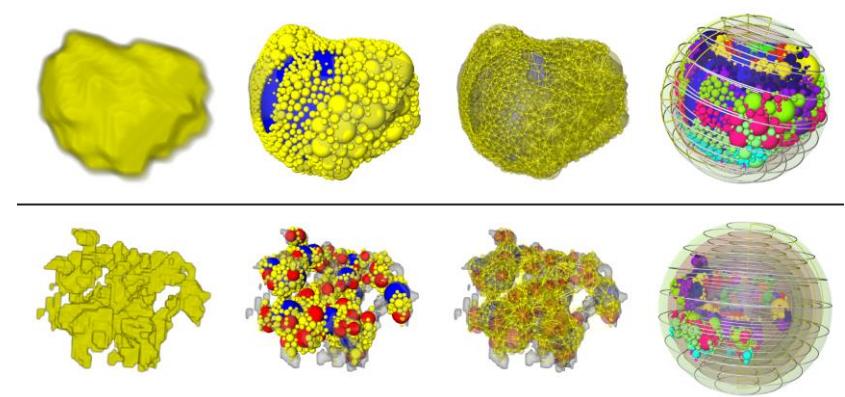
Material Science



3D Printing

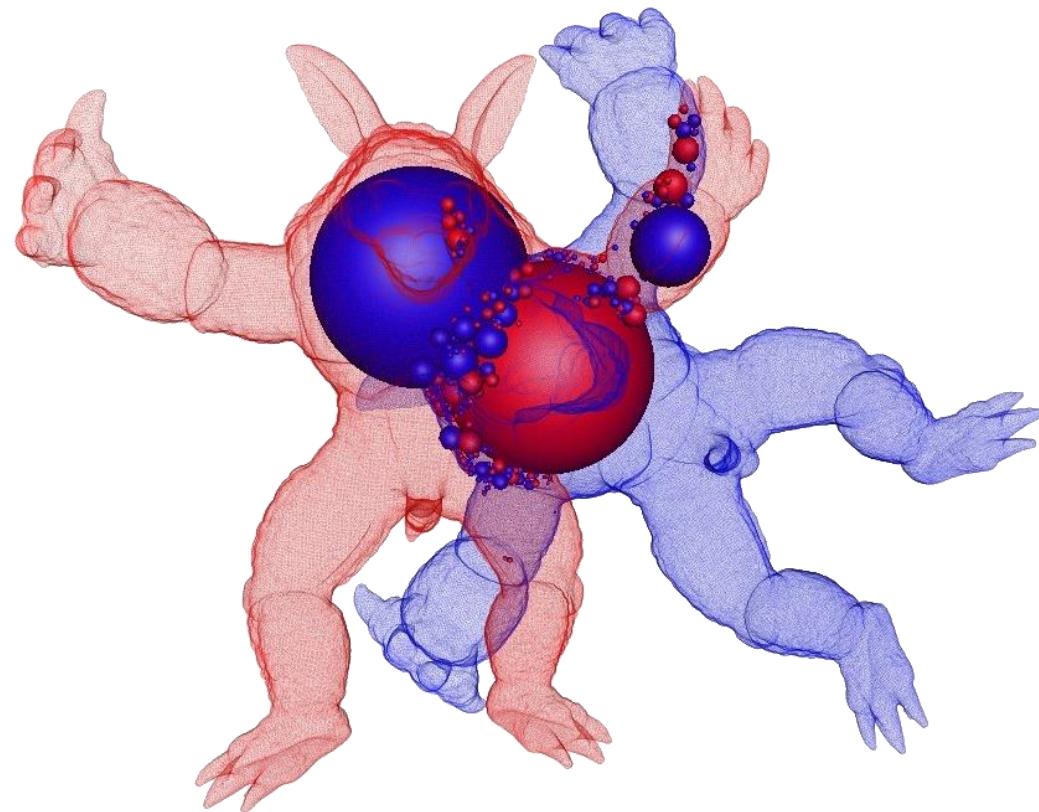


Gravitational Field of Asteroids

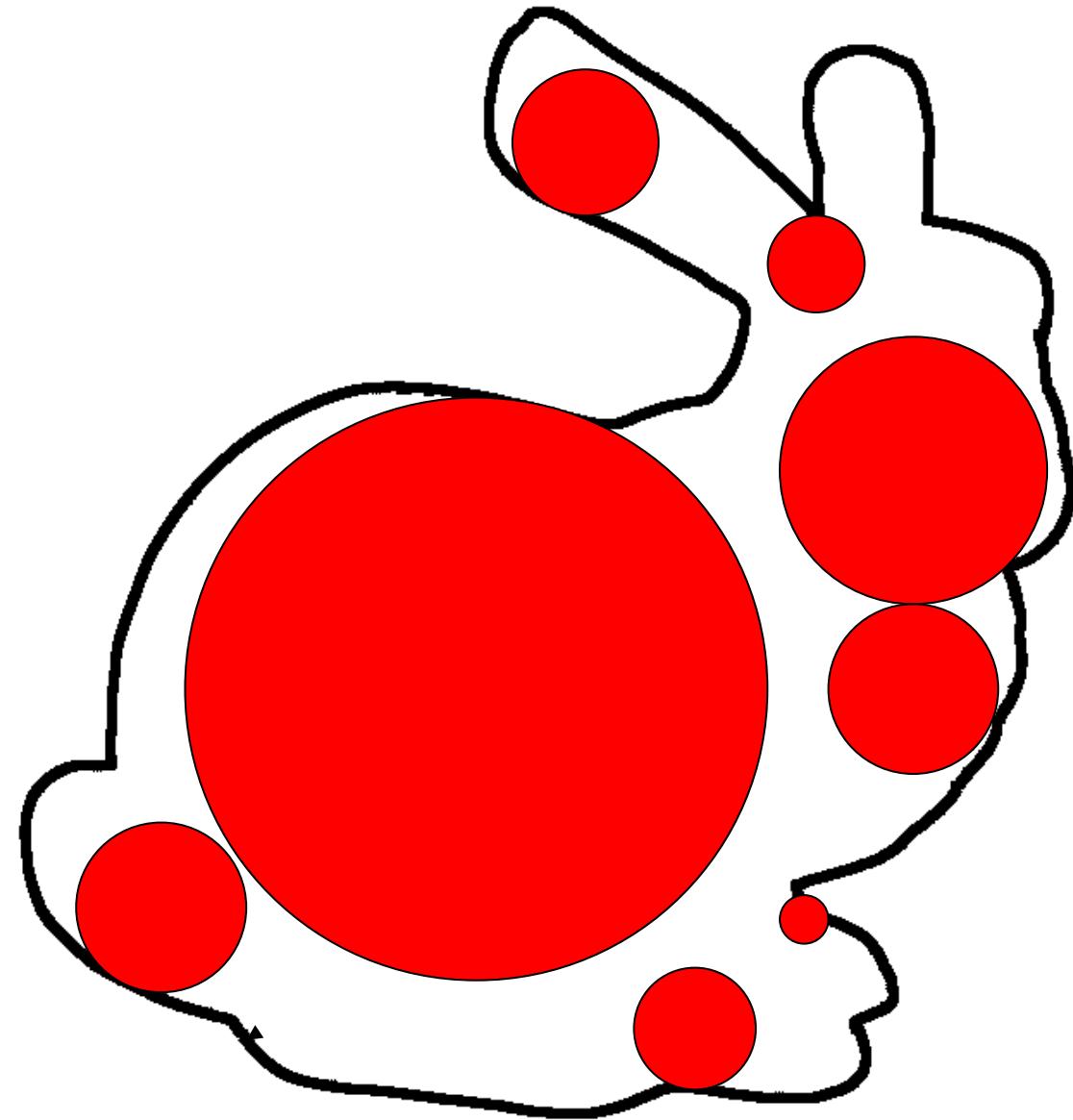


Classification of Carcinoms

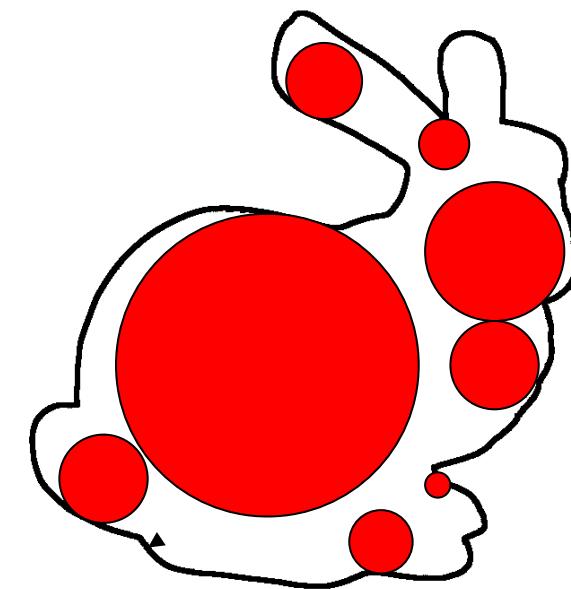
# Back to Collision Detection



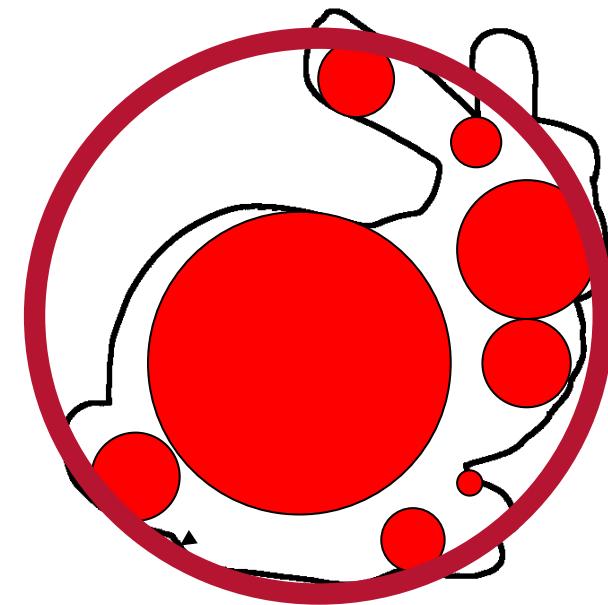
# Hierarchy Creation



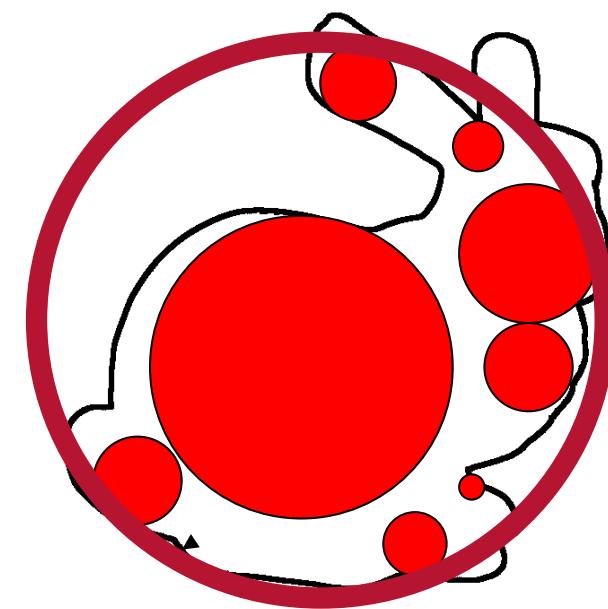
# Hierarchy Creation



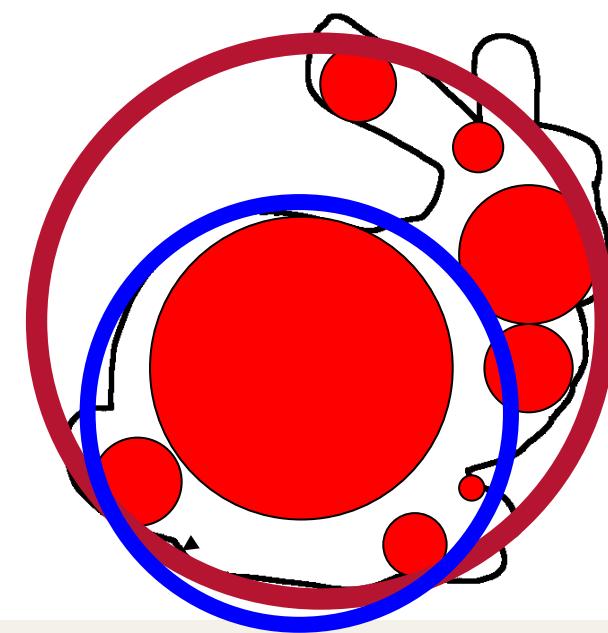
# Hierarchy Creation



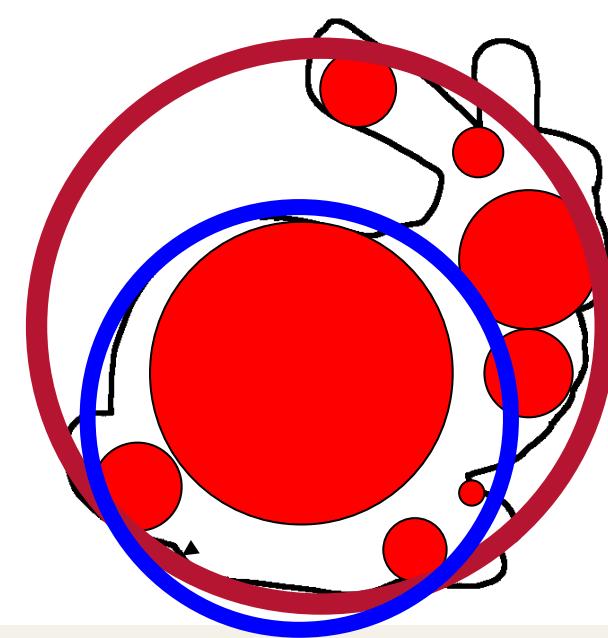
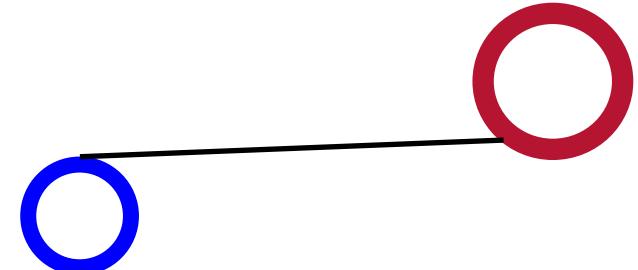
# Hierarchy Creation



# Hierarchy Creation

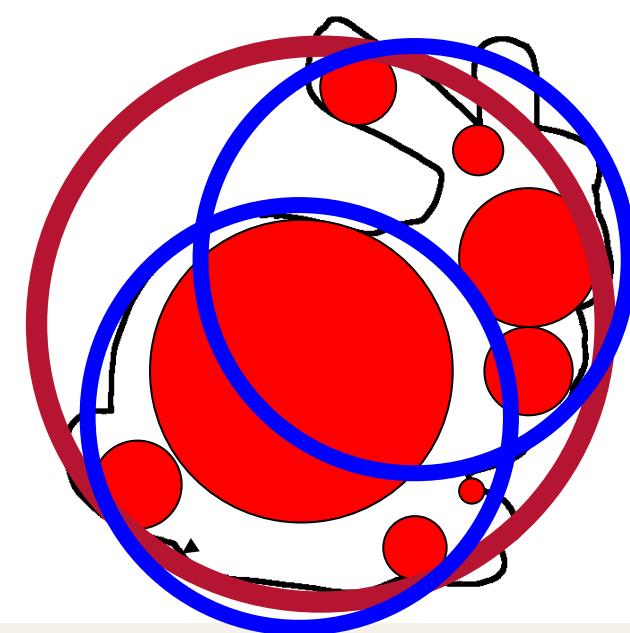
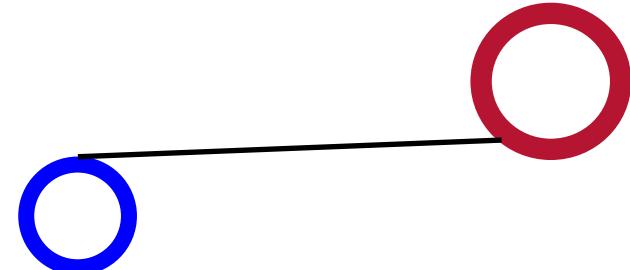


# Hierarchy Creation



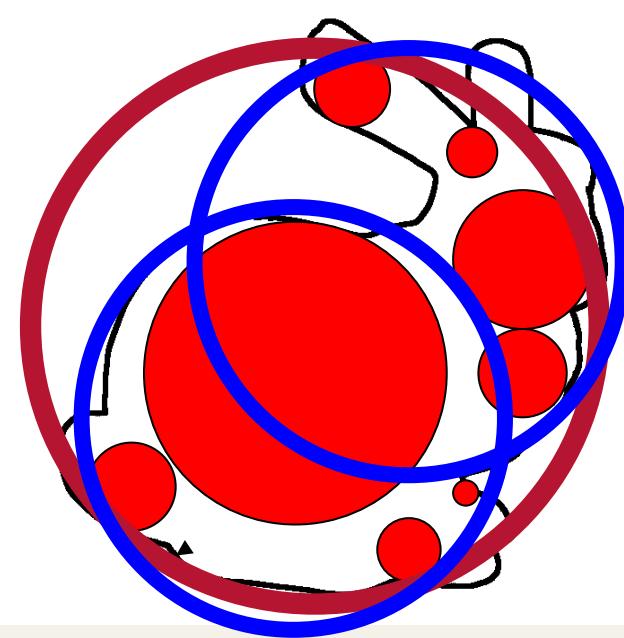
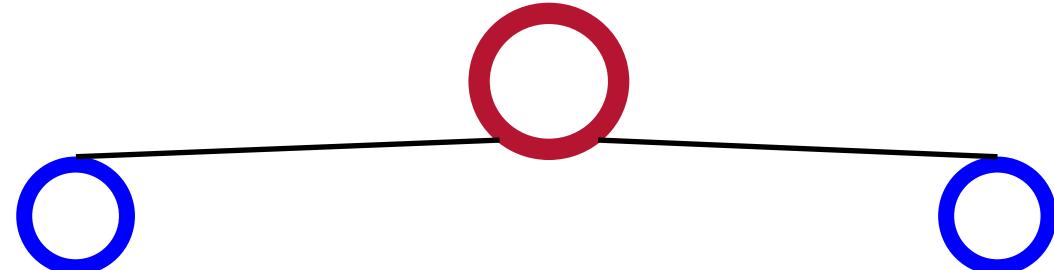


# Hierarchy Creation



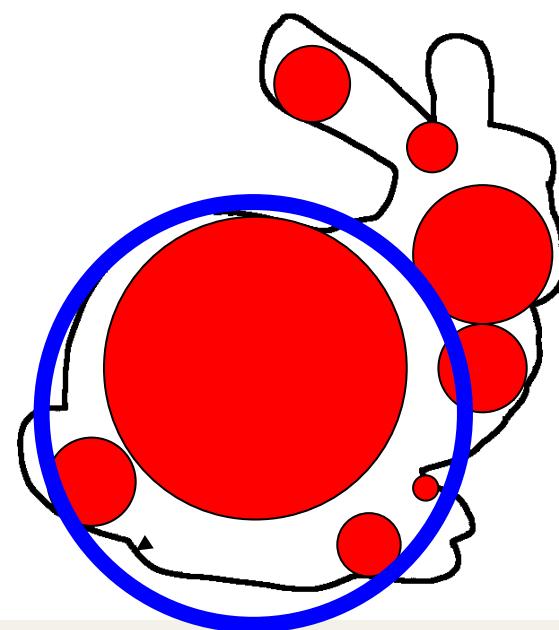
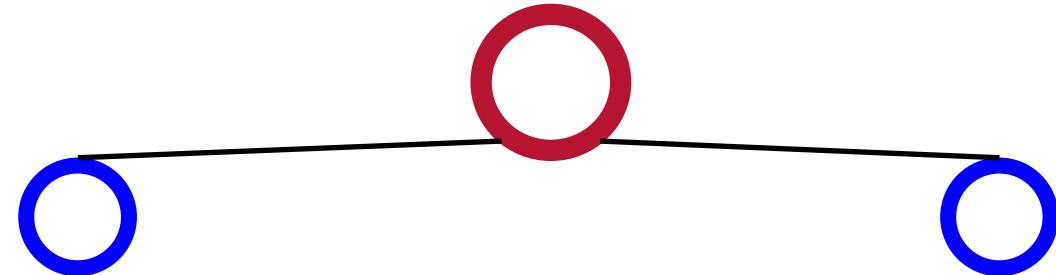


# Hierarchy Creation



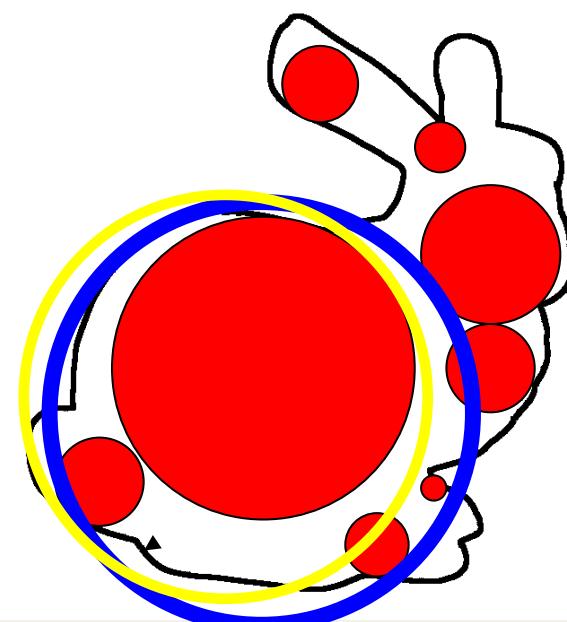
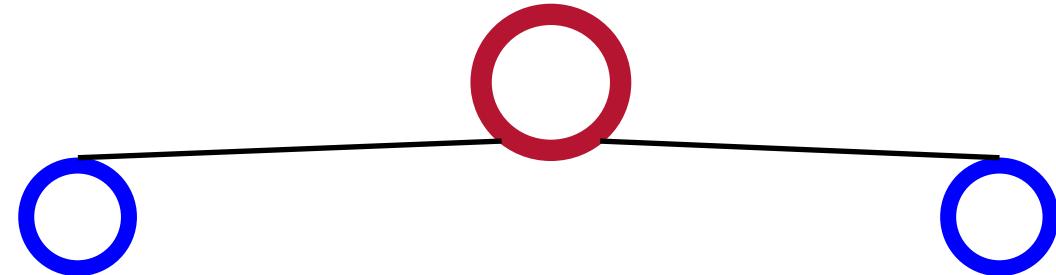


# Hierarchy Creation



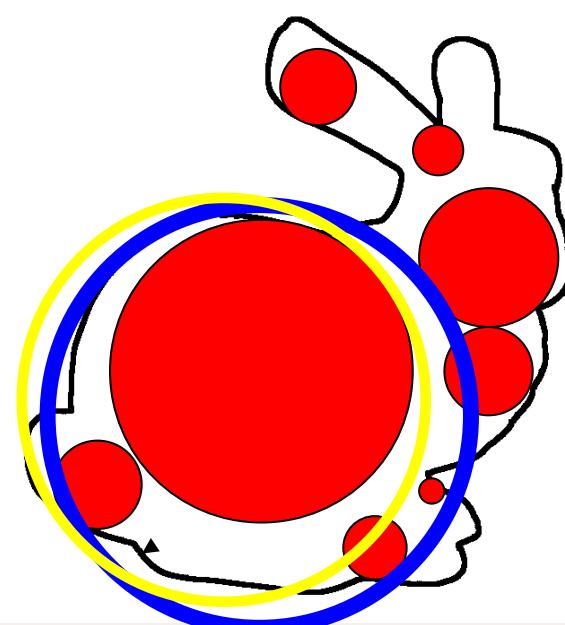
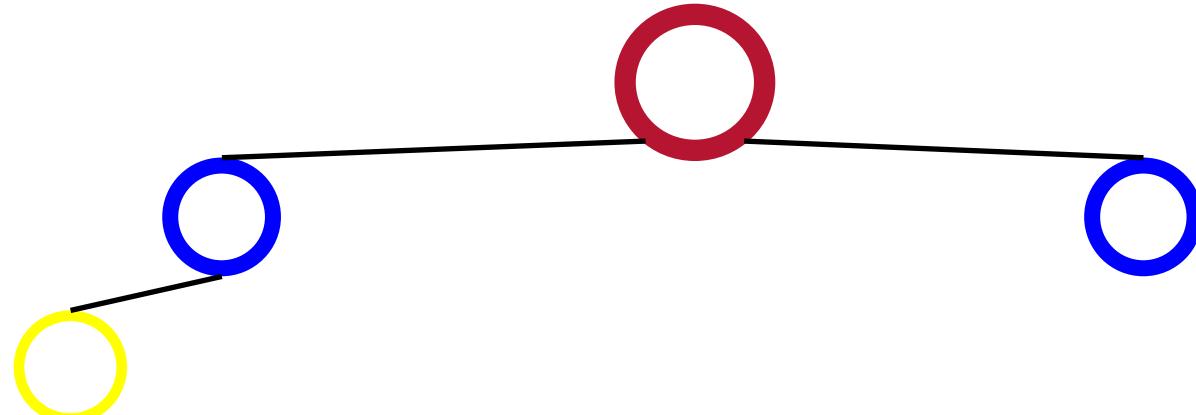


# Hierarchy Creation



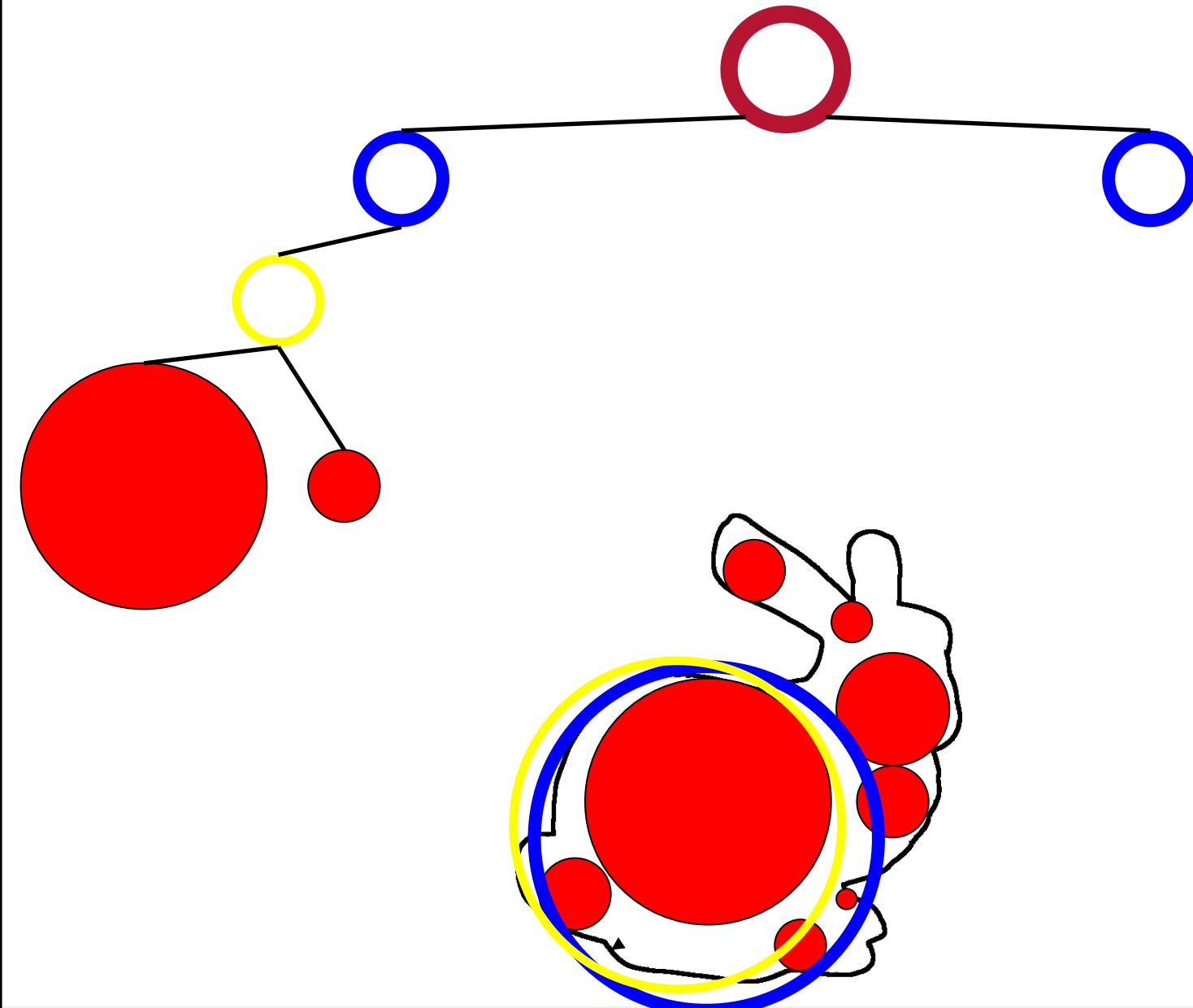


# Hierarchy Creation

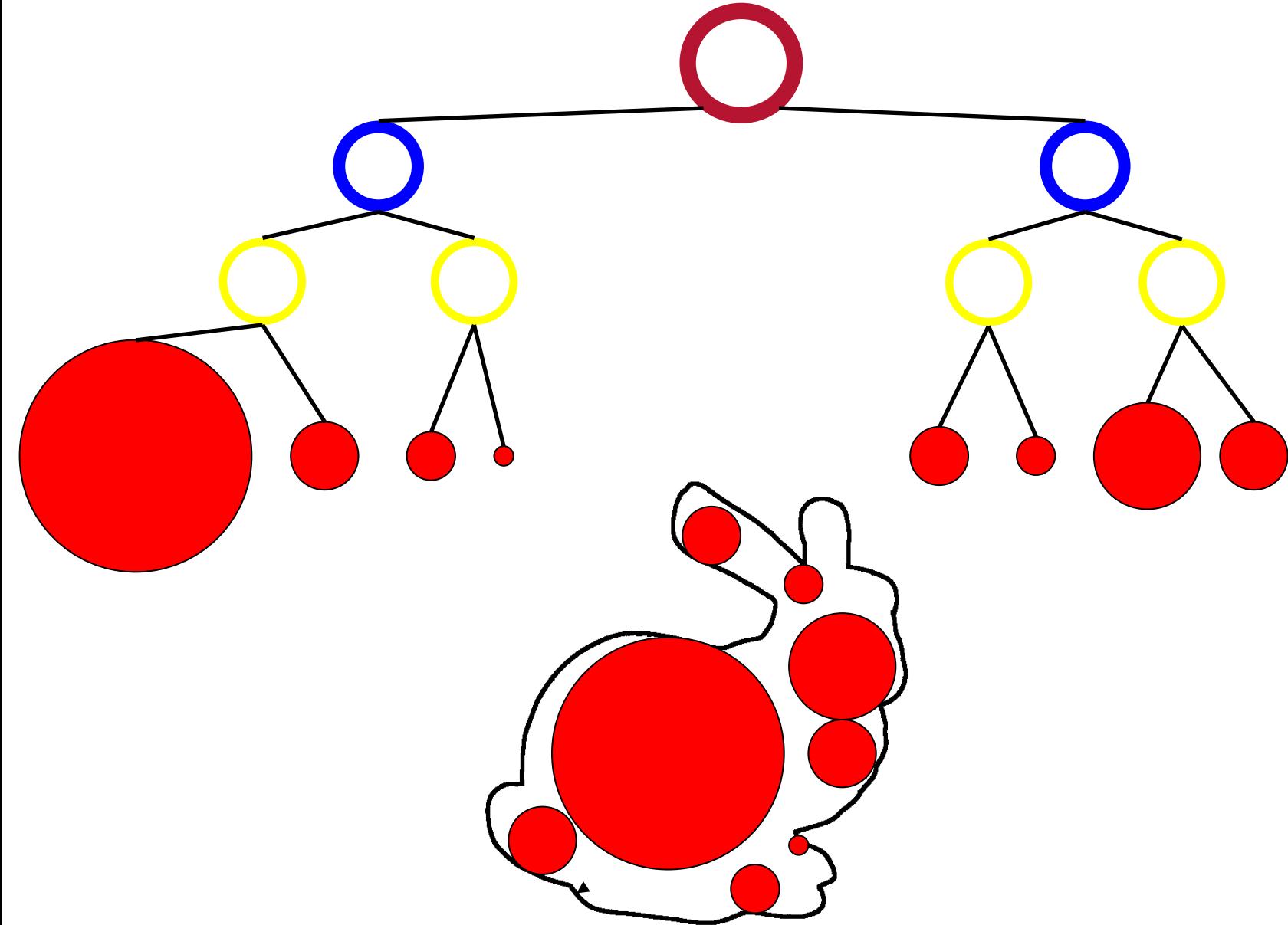




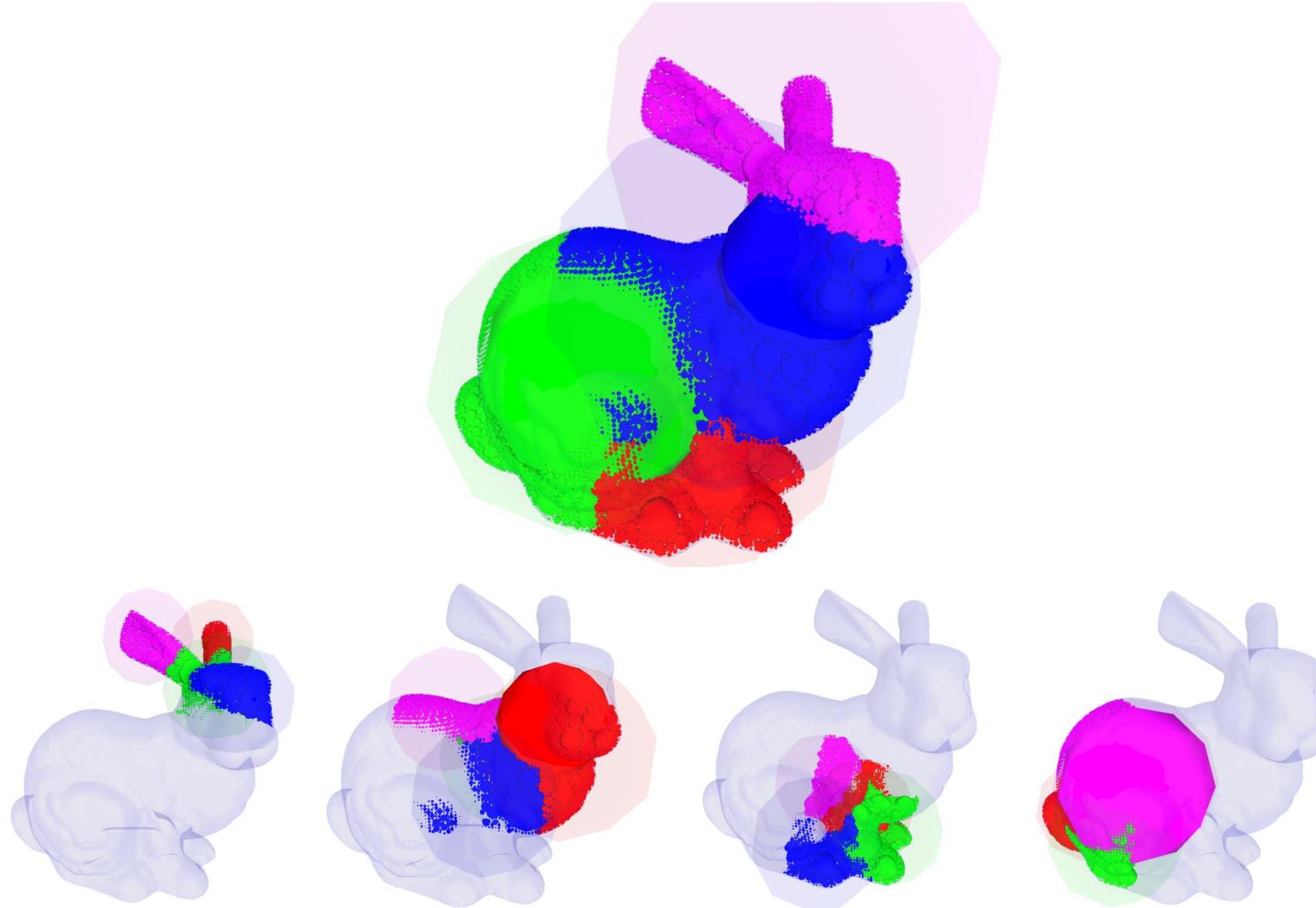
# Hierarchy Creation



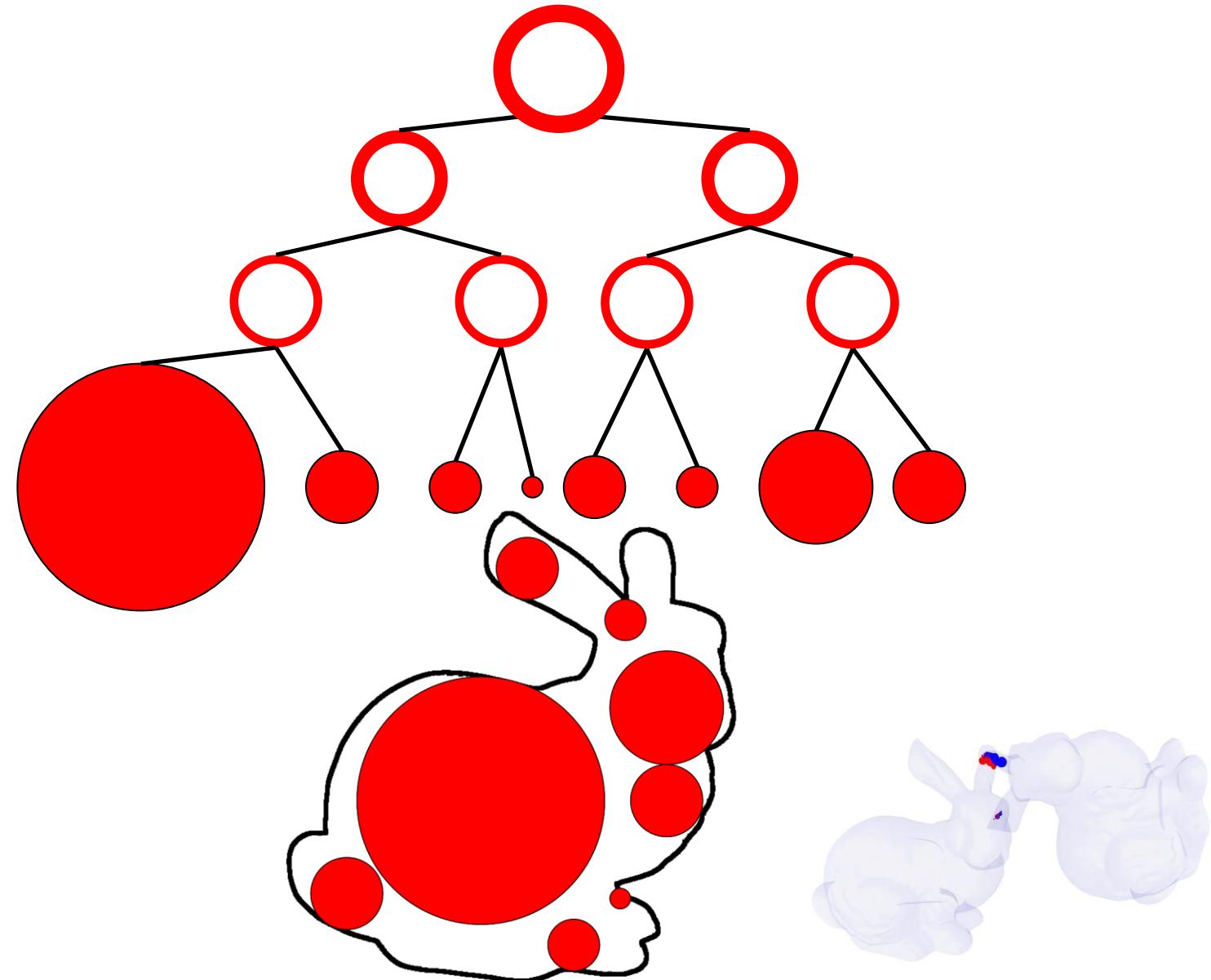
# Hierarchy Creation



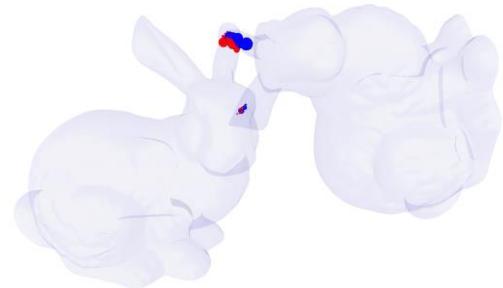
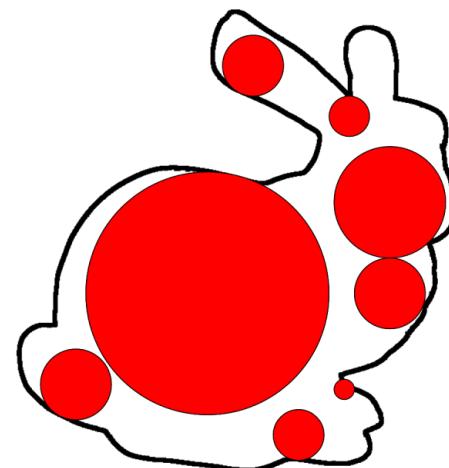
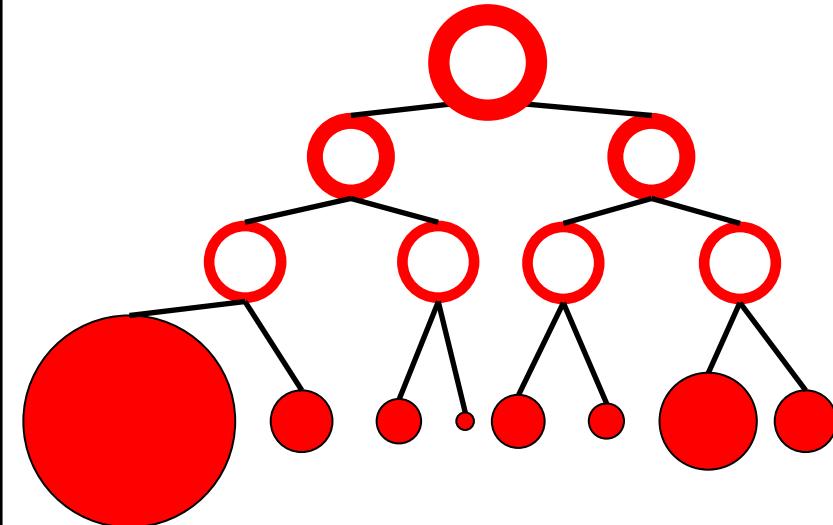
# Bounding Volume Hierarchy for Inner Spheres



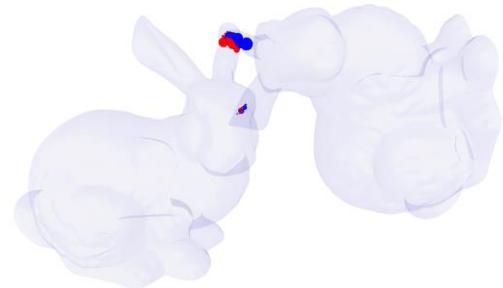
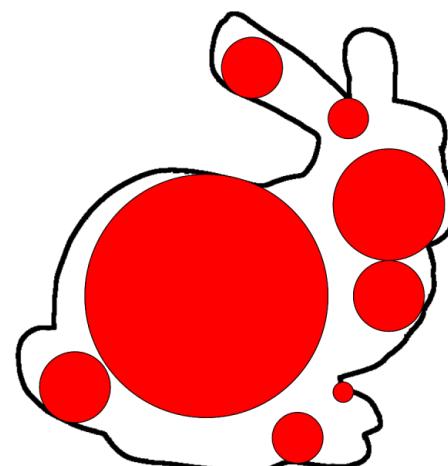
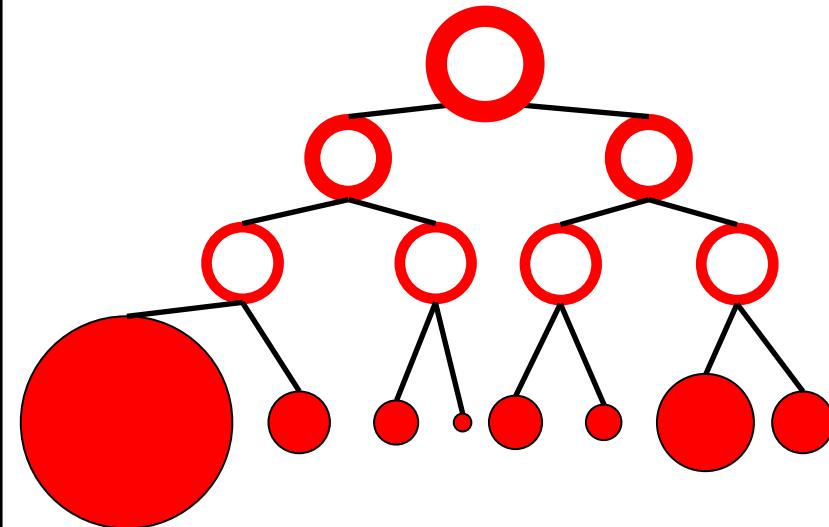
# BVH Traversal: Penetration Volume Queries



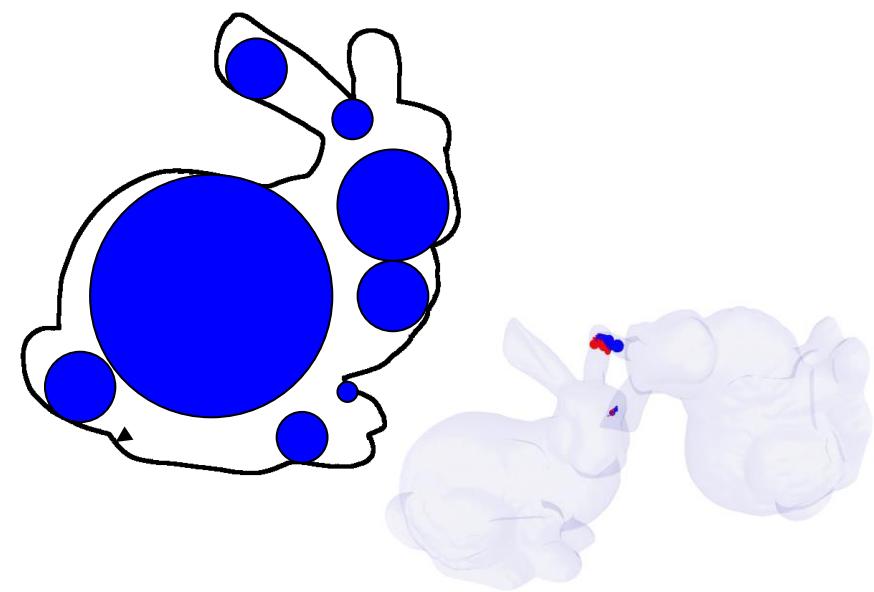
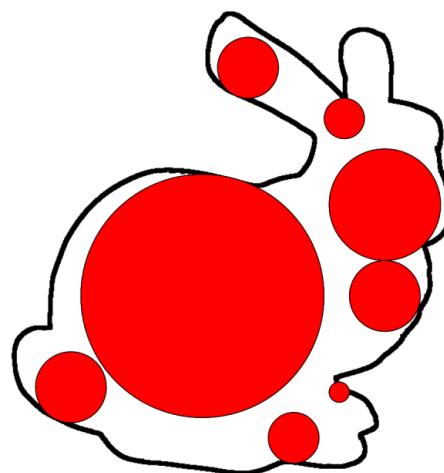
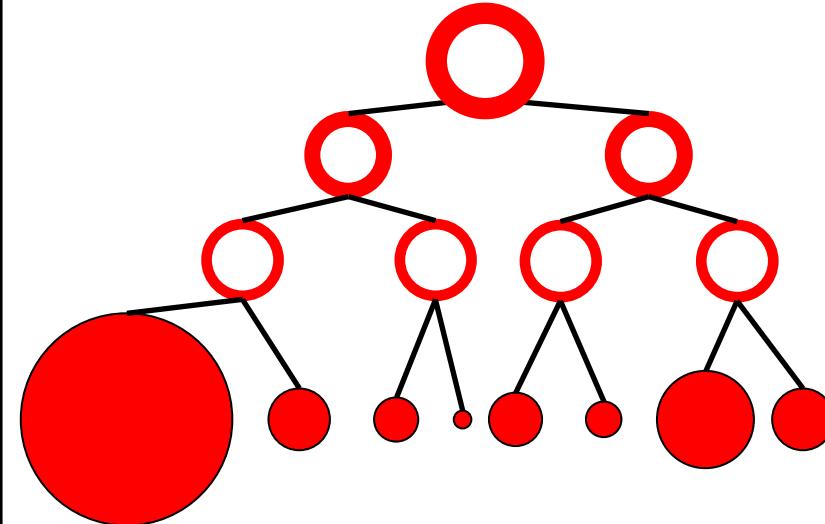
# BVH Traversal: Penetration Volume Queries



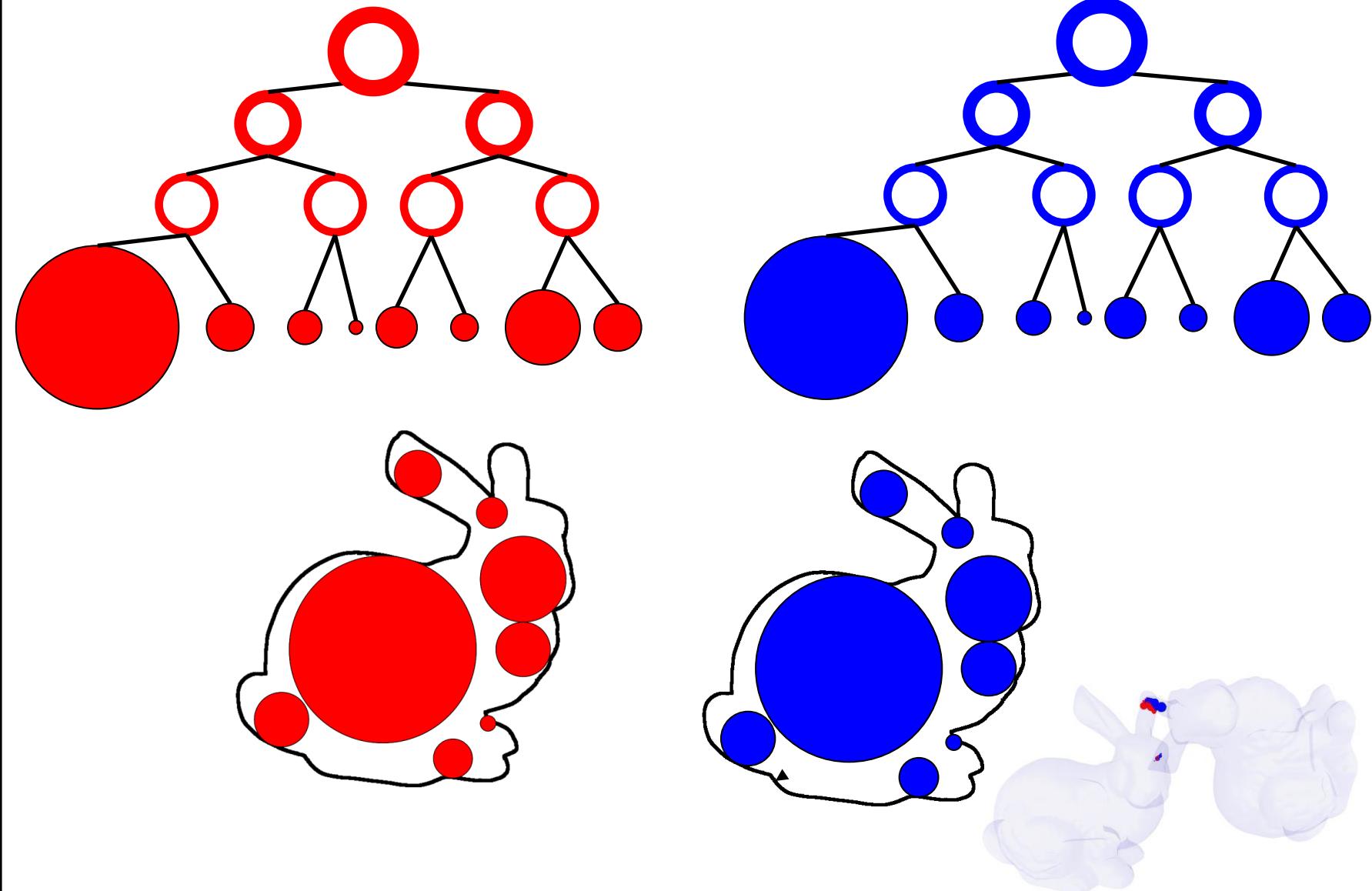
# BVH Traversal: Penetration Volume Queries



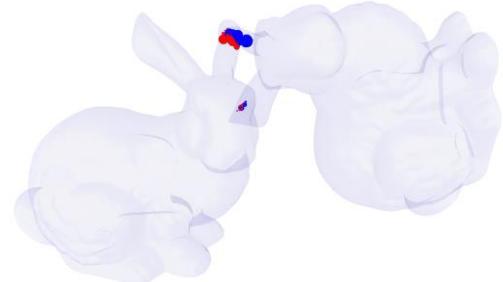
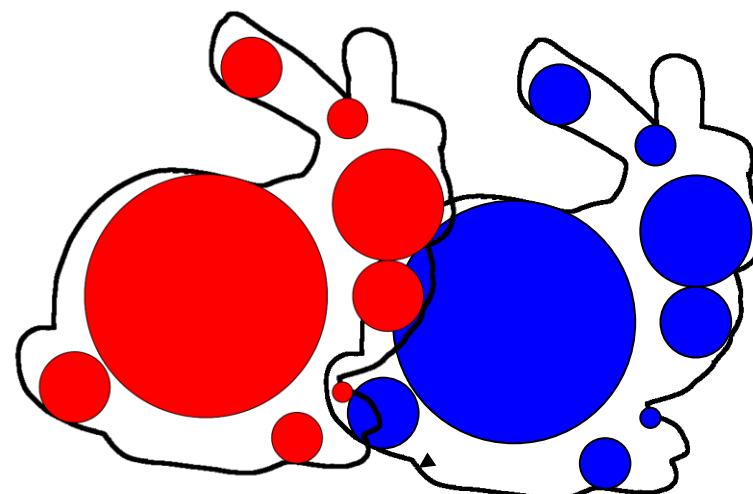
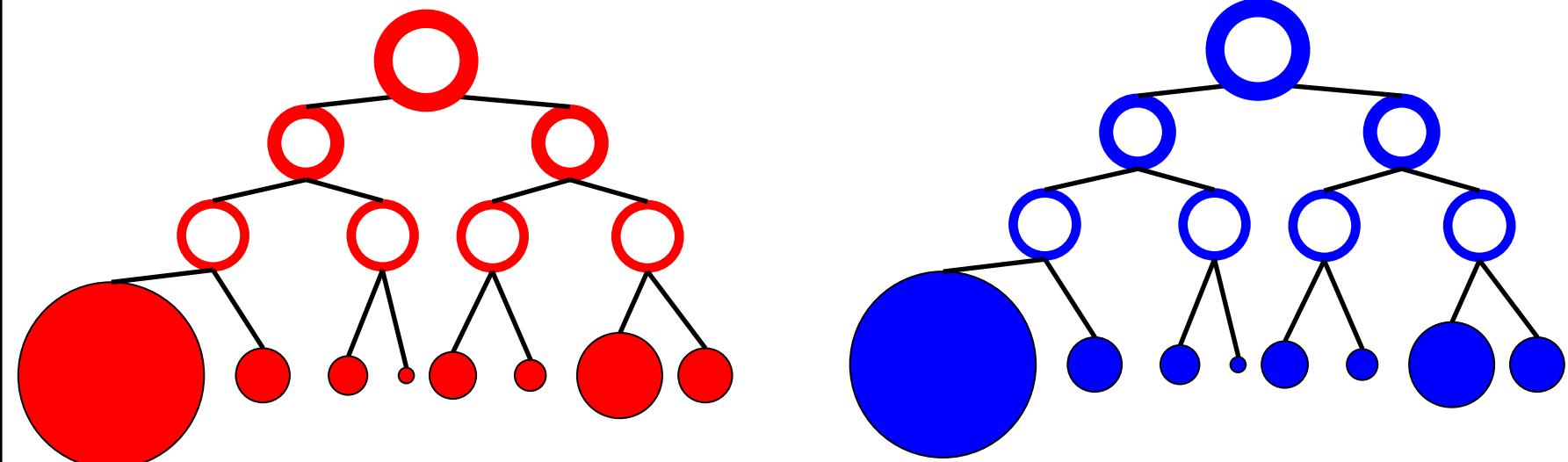
# BVH Traversal: Penetration Volume Queries



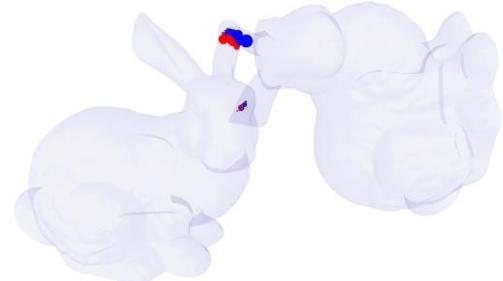
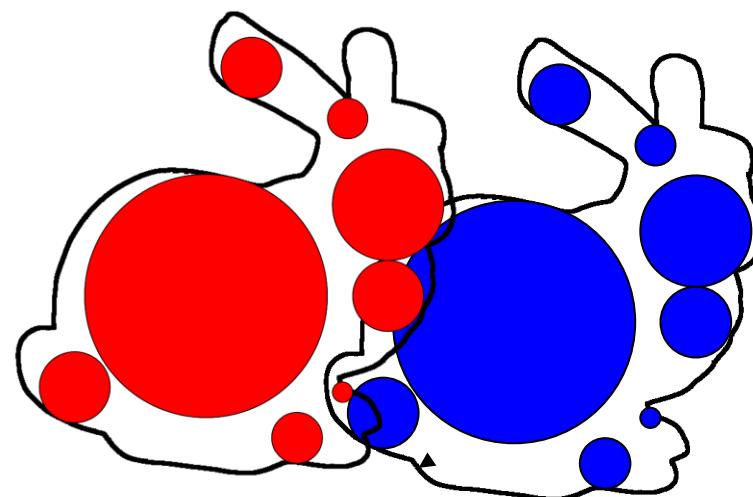
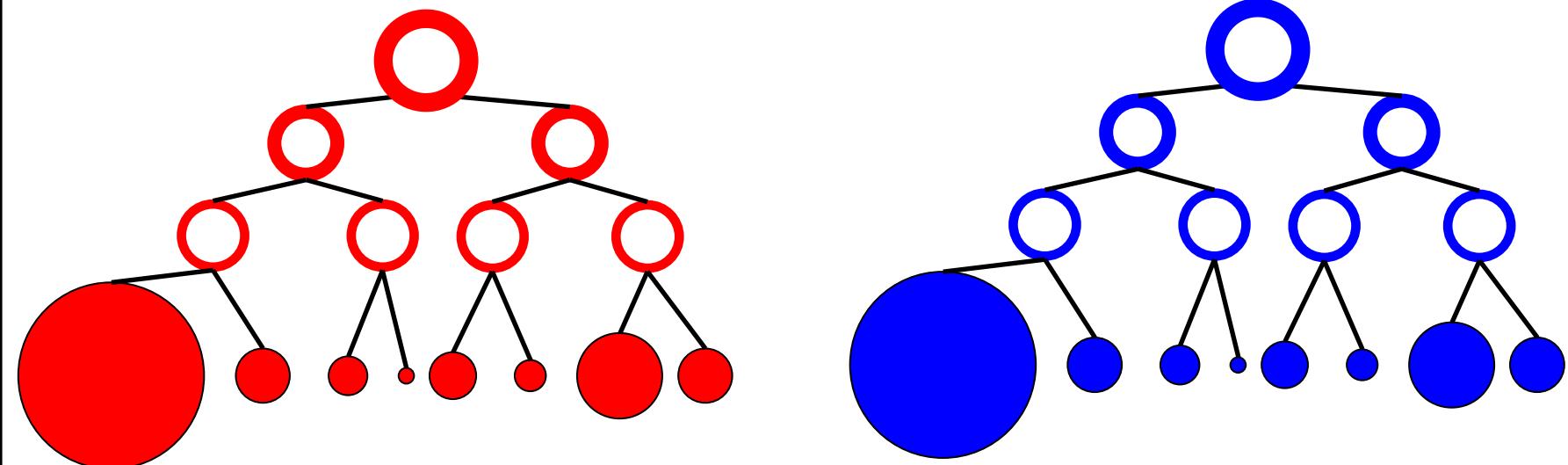
# BVH Traversal: Penetration Volume Queries



# BVH Traversal: Penetration Volume Queries

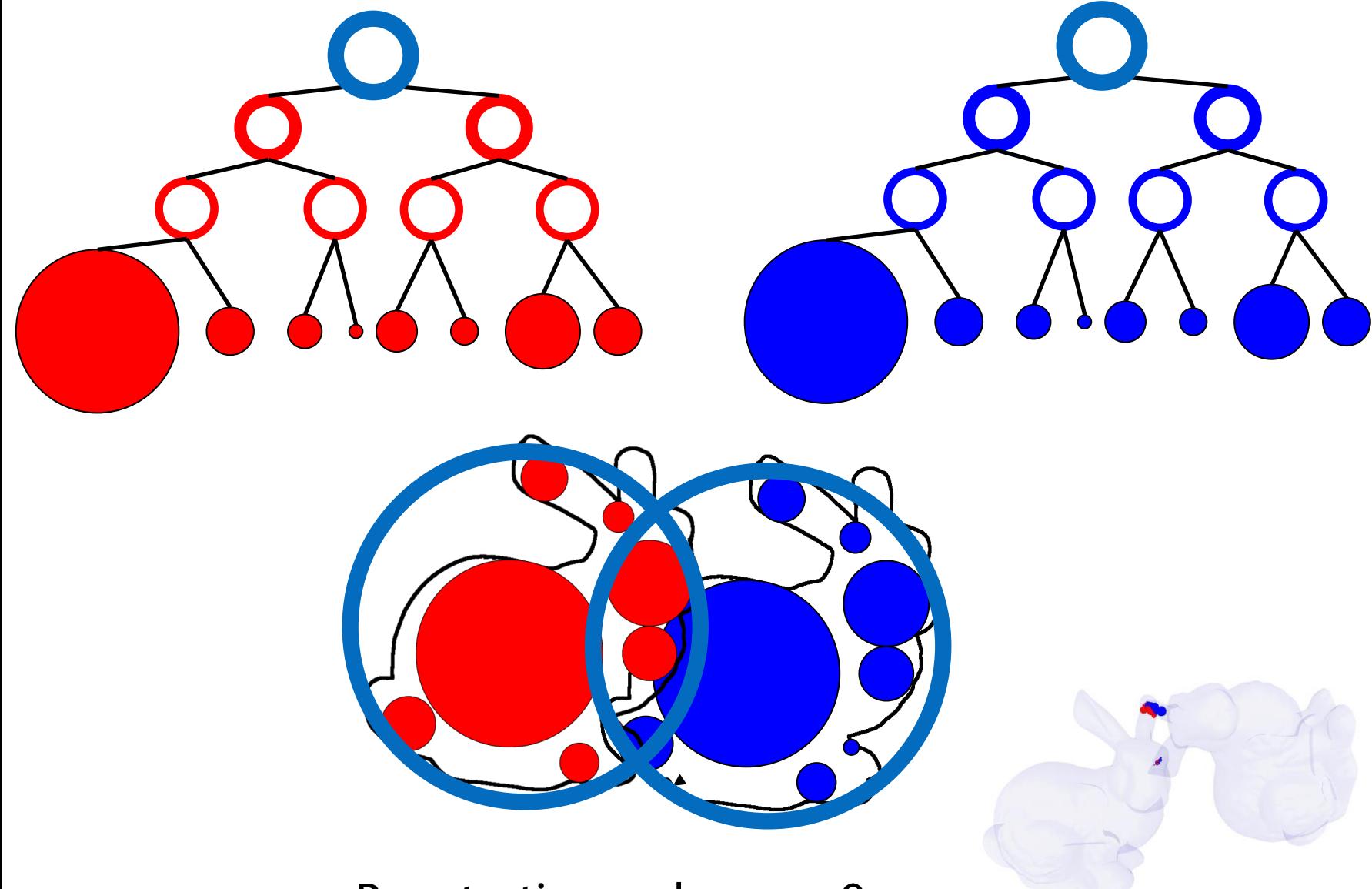


# BVH Traversal: Penetration Volume Queries



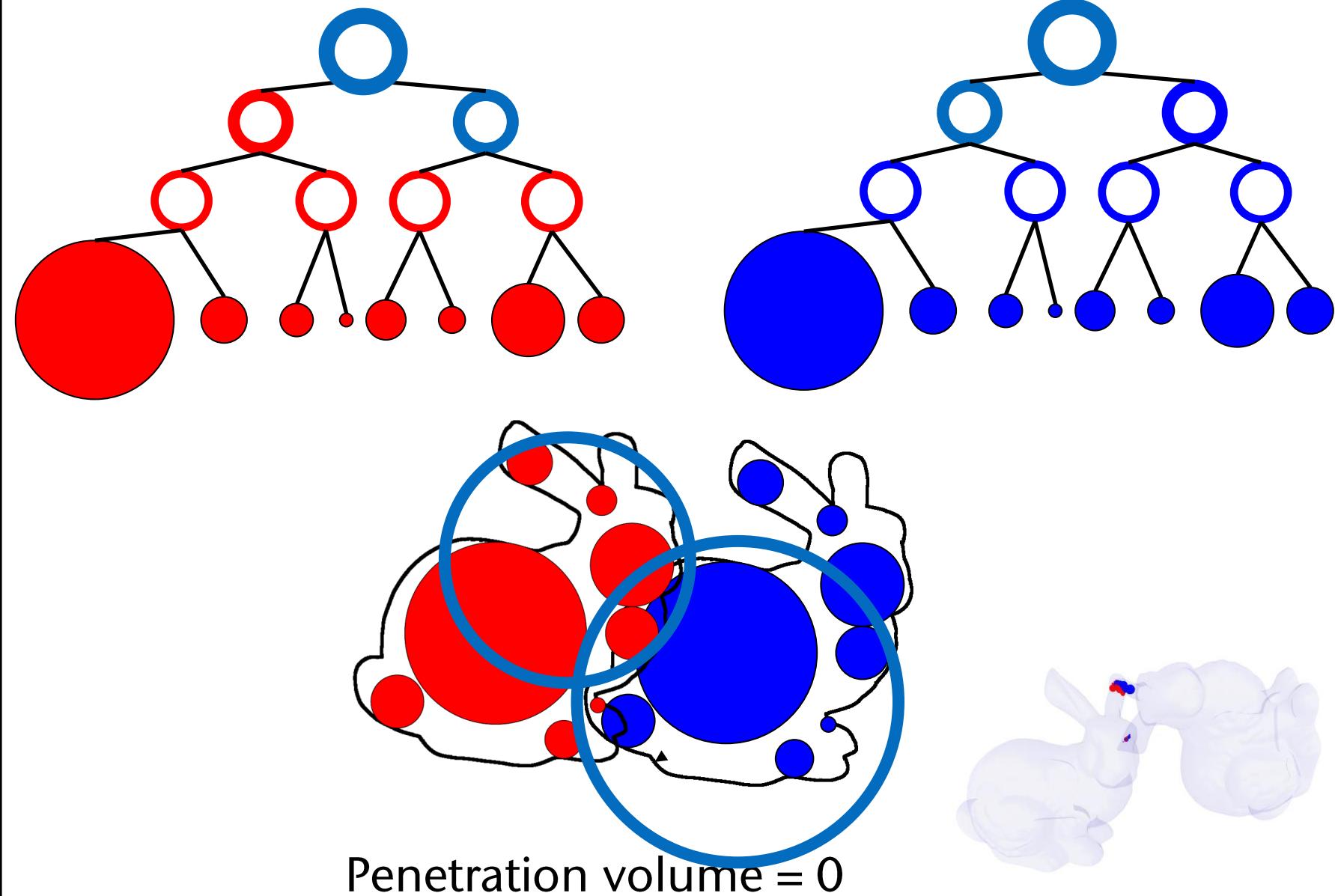
Penetration volume = 0

# BVH Traversal: Penetration Volume Queries

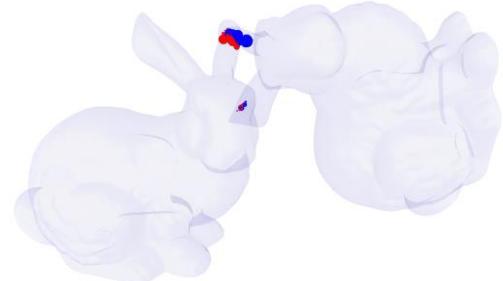
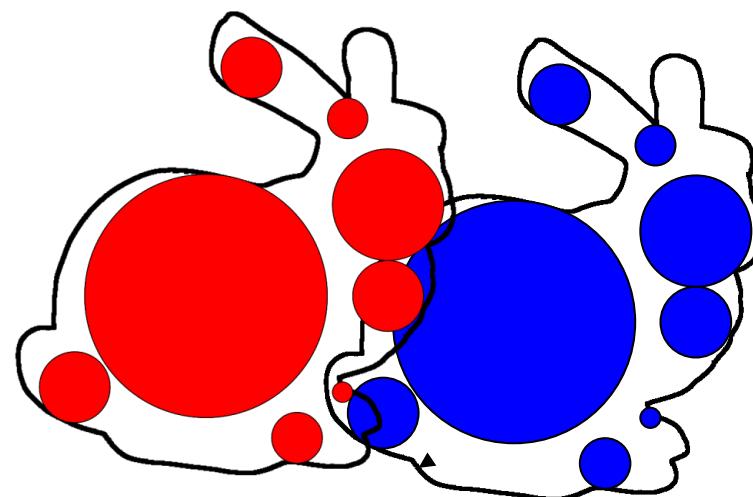
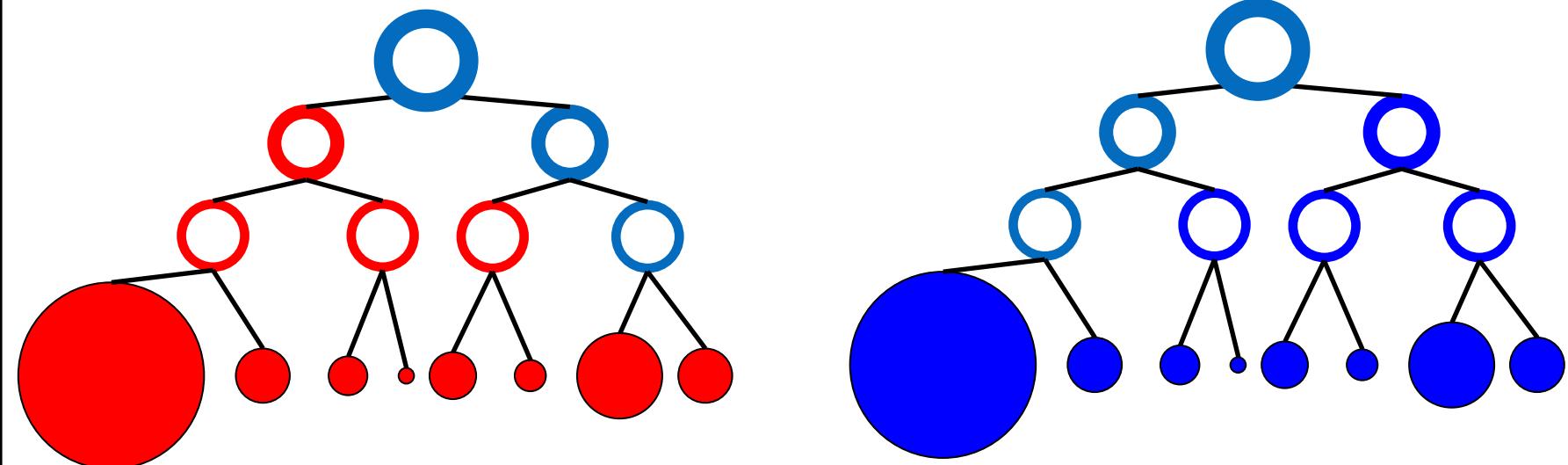


Penetration volume = 0

# BVH Traversal: Penetration Volume Queries

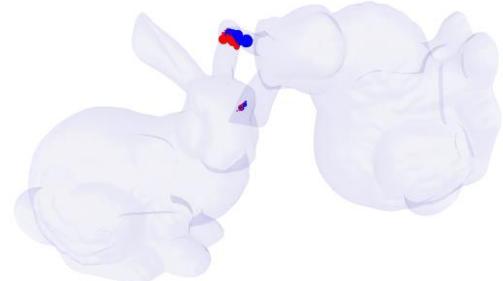
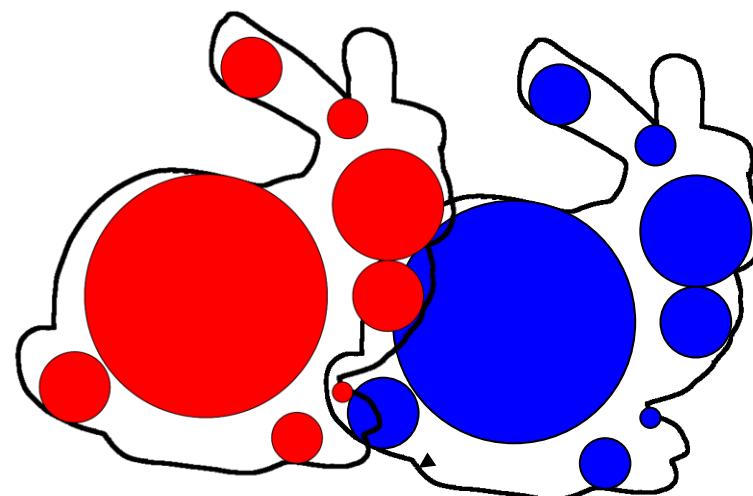
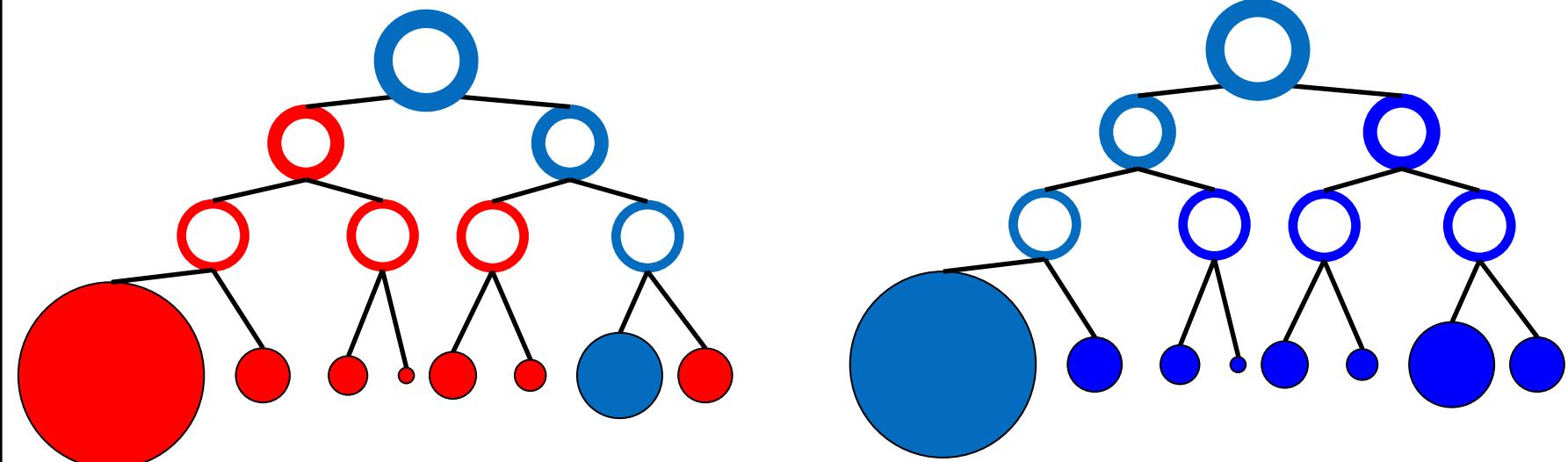


# BVH Traversal: Penetration Volume Queries



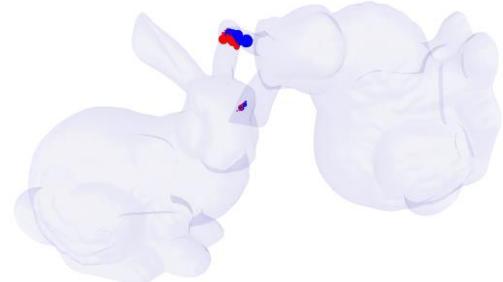
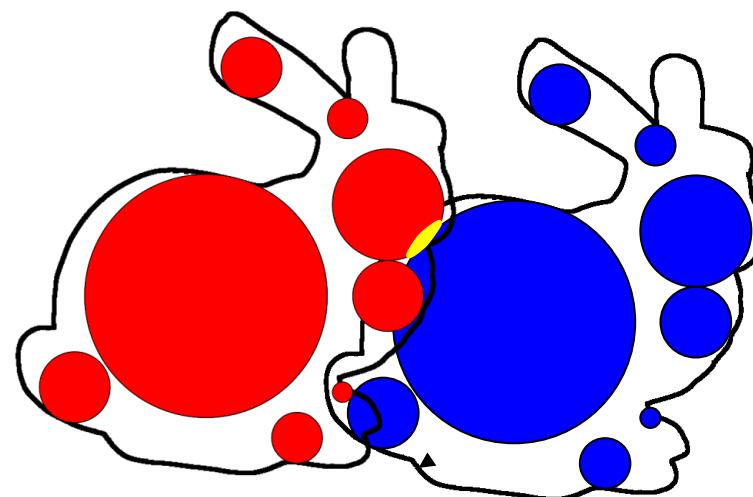
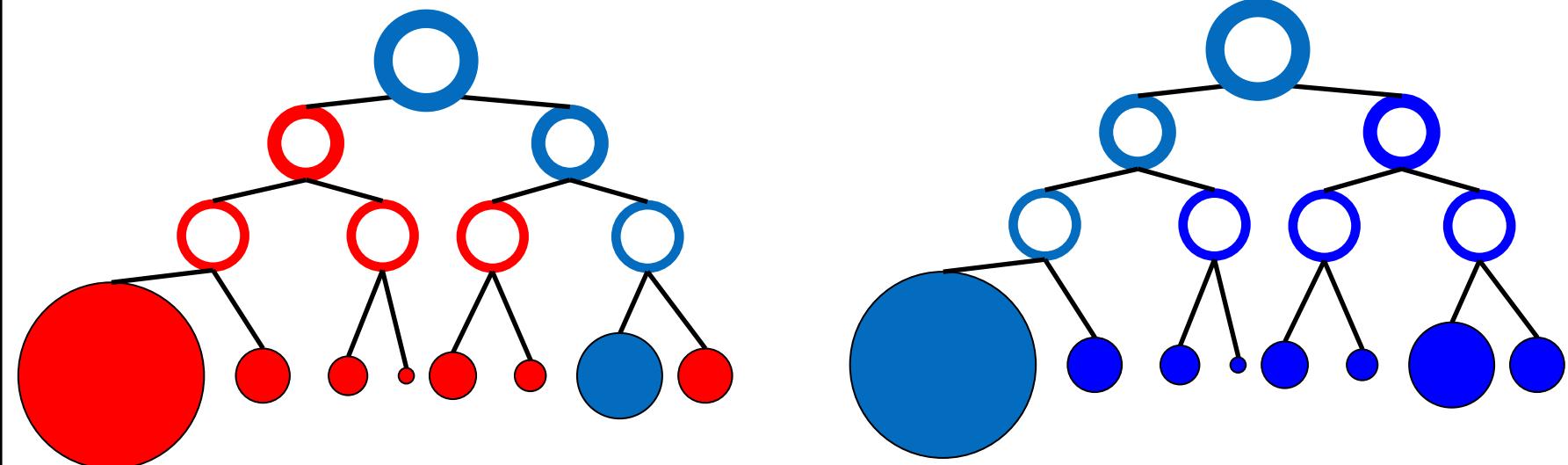
Penetration volume = 0

# BVH Traversal: Penetration Volume Queries



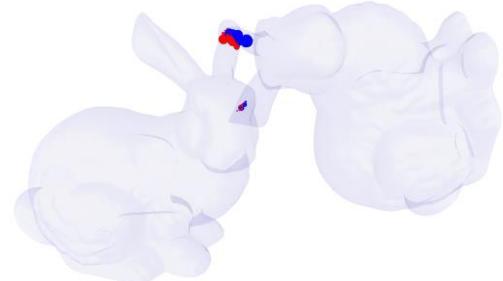
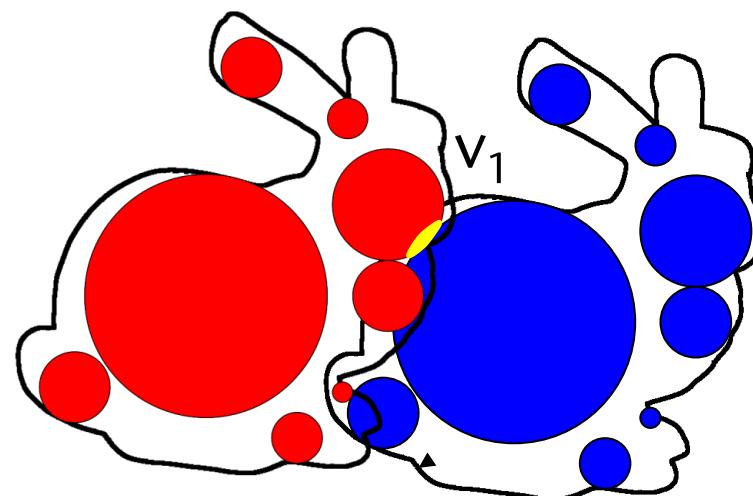
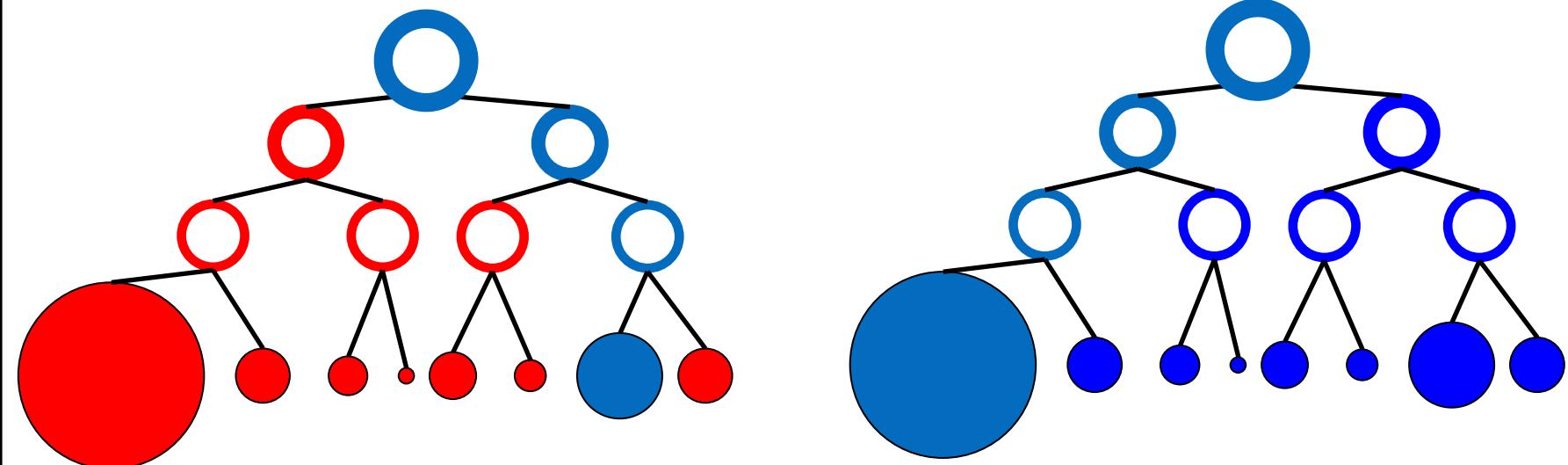
Penetration volume = 0

# BVH Traversal: Penetration Volume Queries



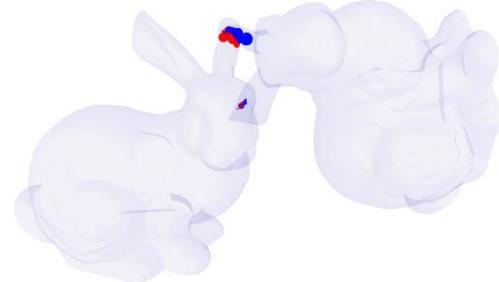
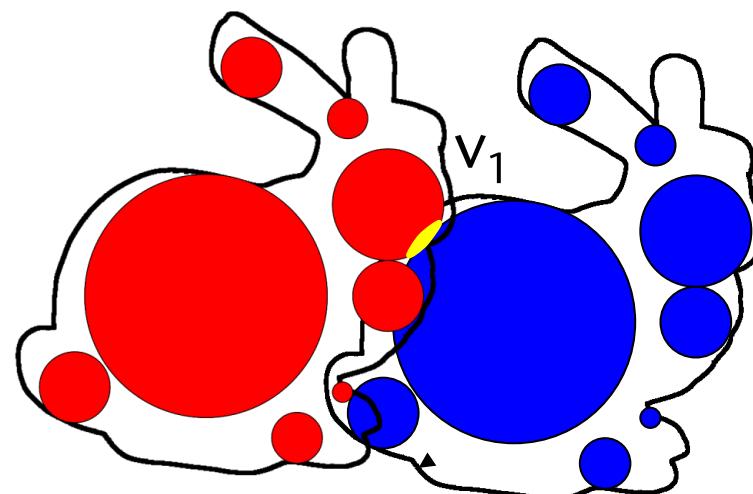
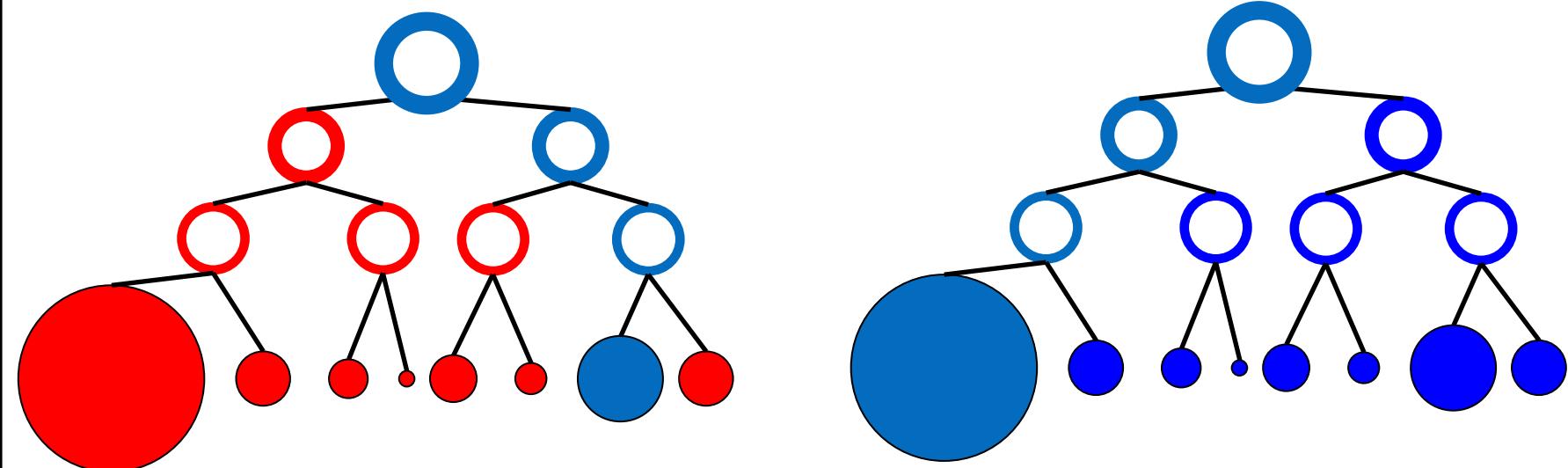
Penetration volume = 0

# BVH Traversal: Penetration Volume Queries

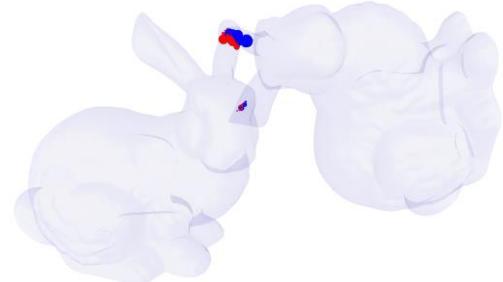
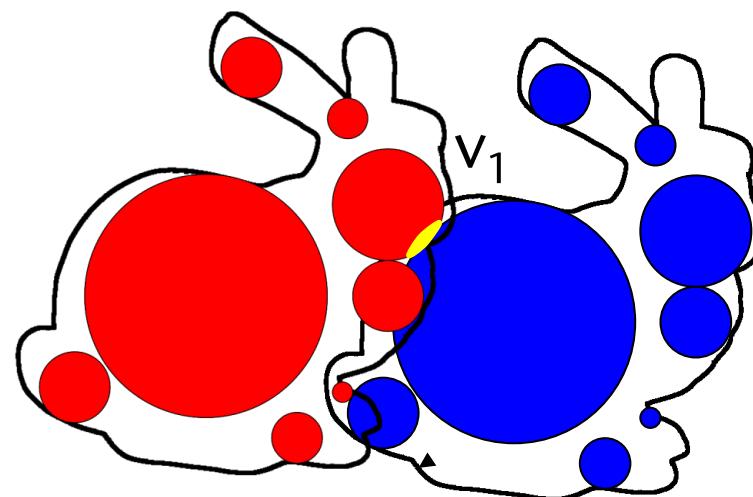
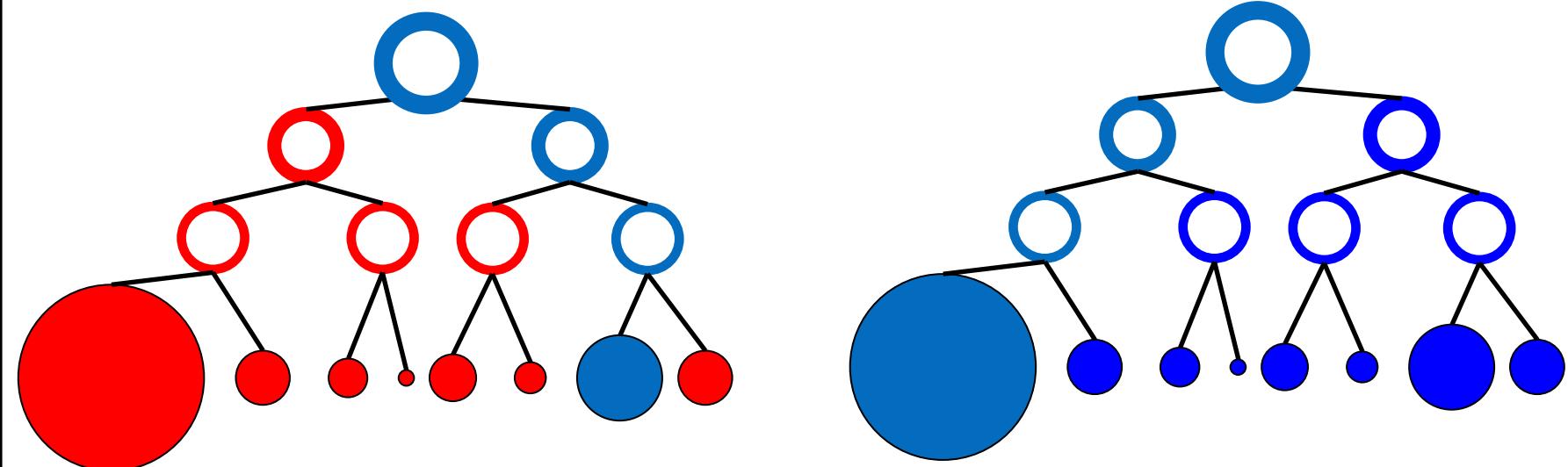


Penetration volume = 0

# BVH Traversal: Penetration Volume Queries

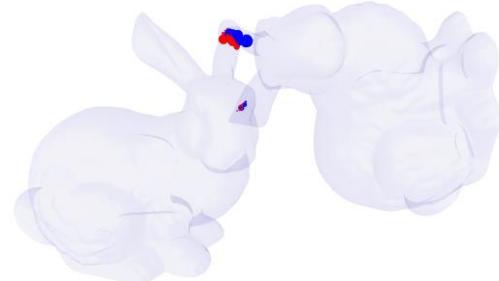
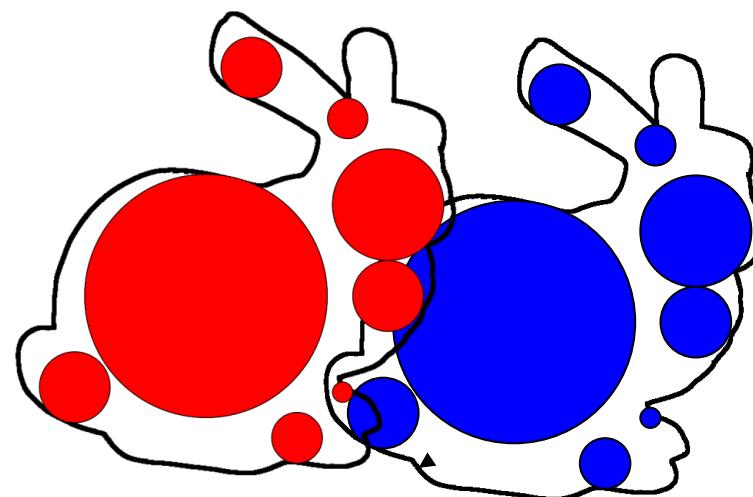
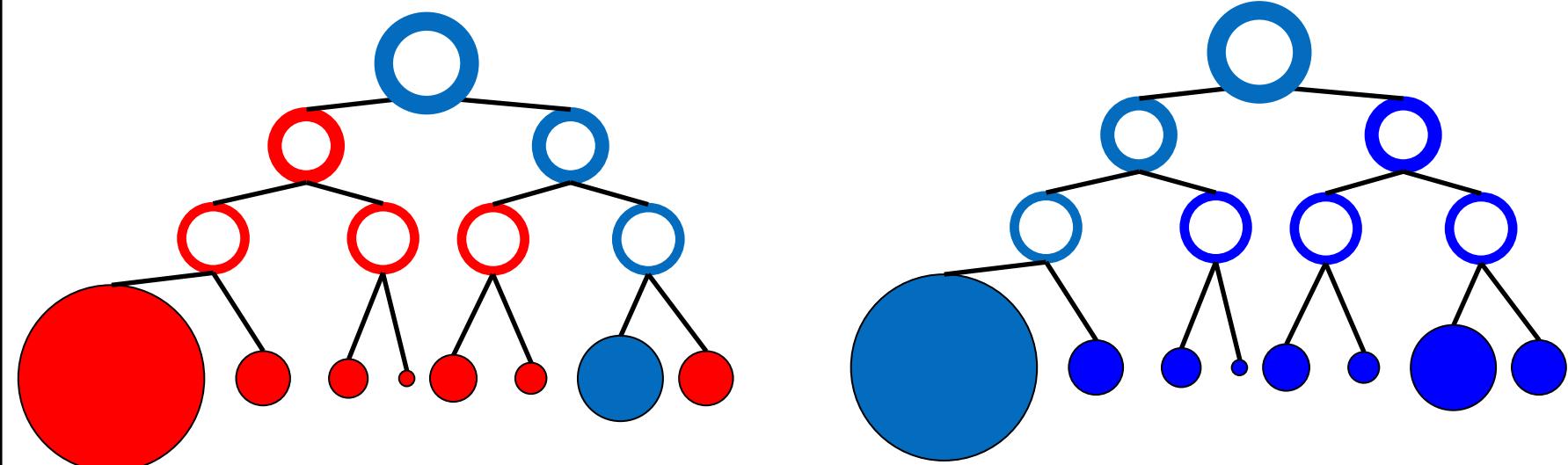


# BVH Traversal: Penetration Volume Queries



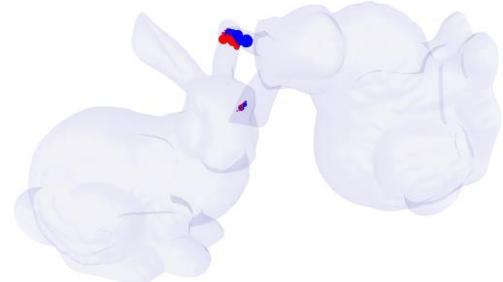
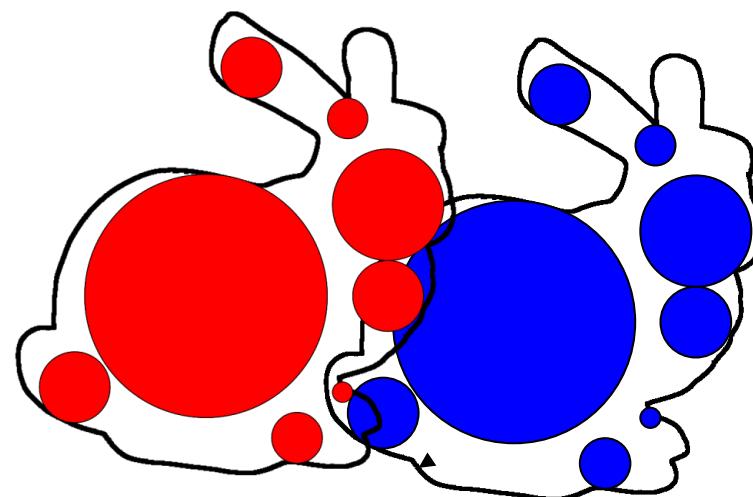
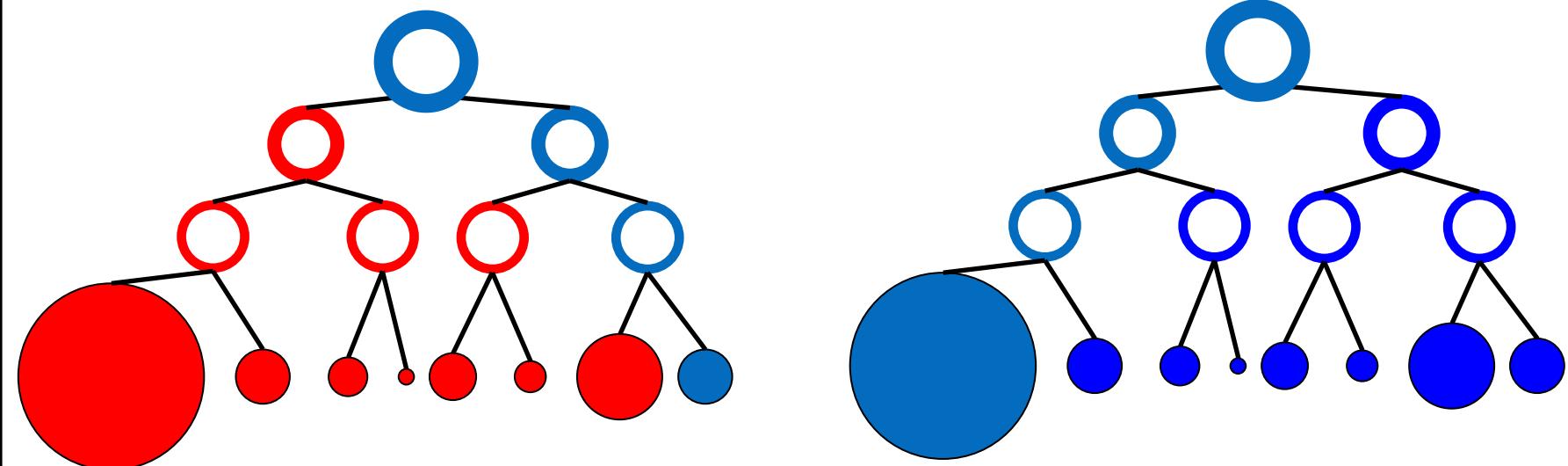
Penetration volume =  $v_1$

# BVH Traversal: Penetration Volume Queries



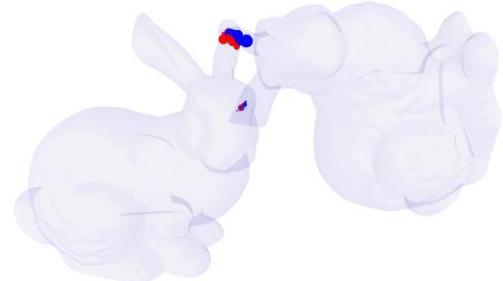
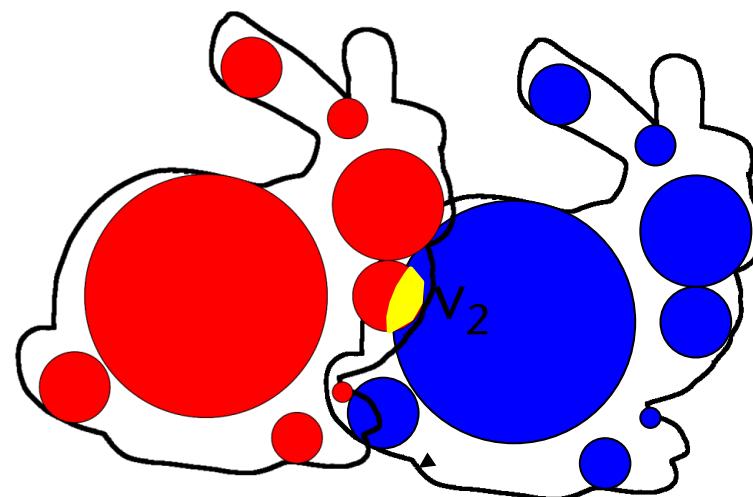
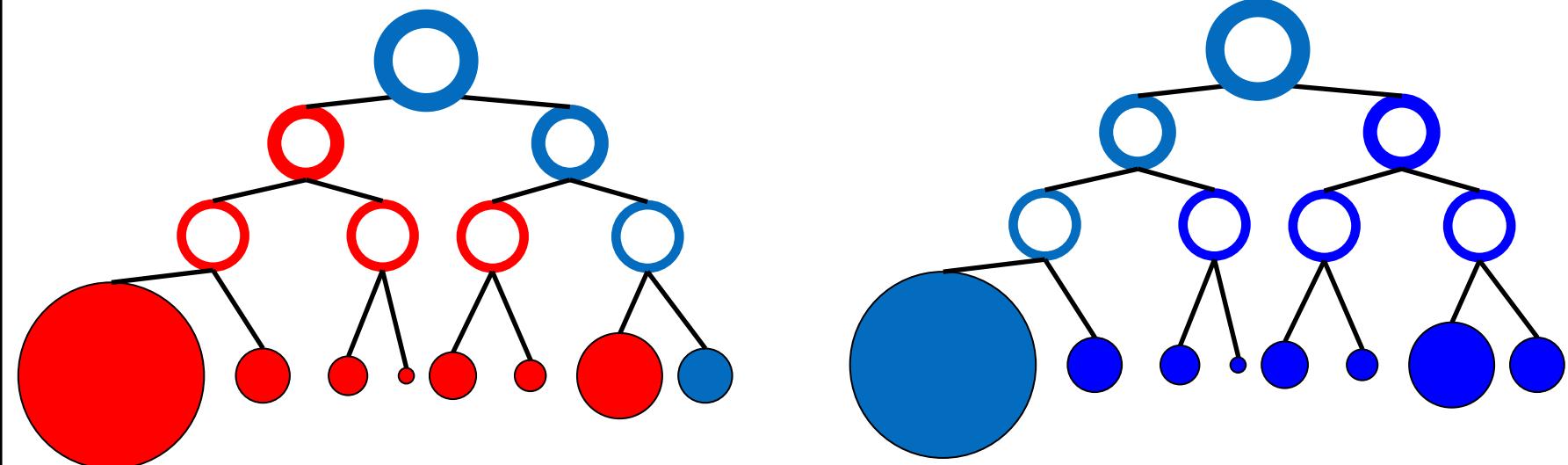
Penetration volume =  $v_1$

# BVH Traversal: Penetration Volume Queries



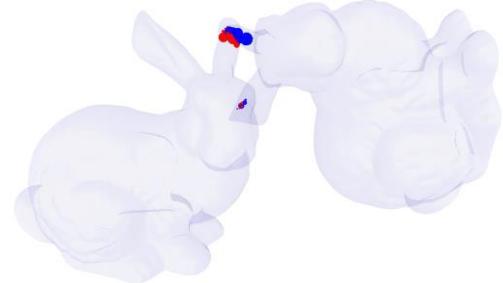
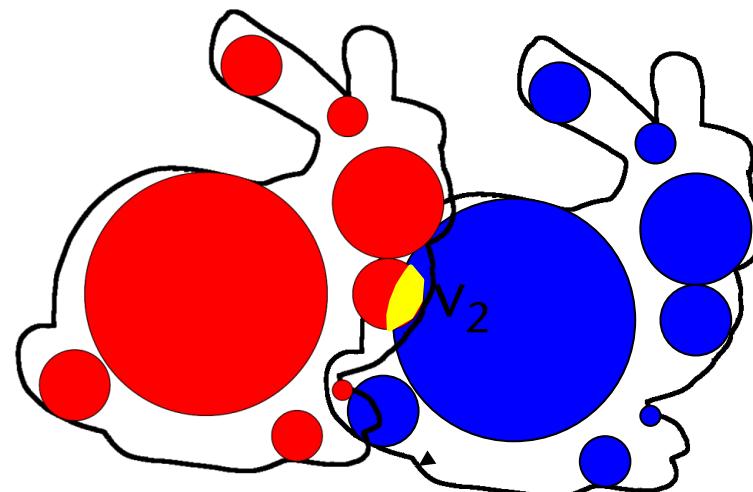
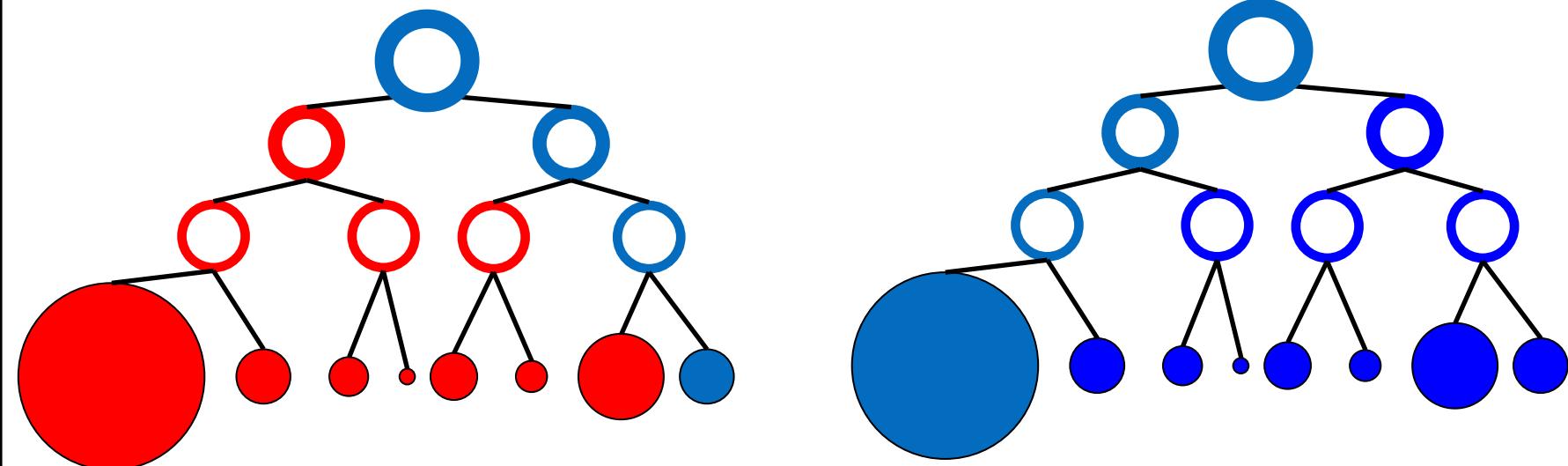
Penetration volume =  $v_1$

# BVH Traversal: Penetration Volume Queries

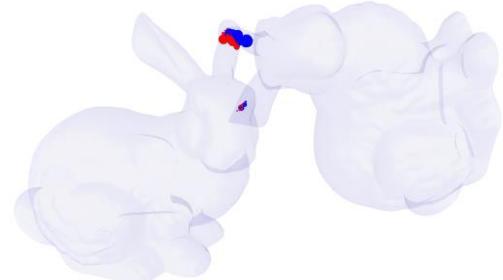
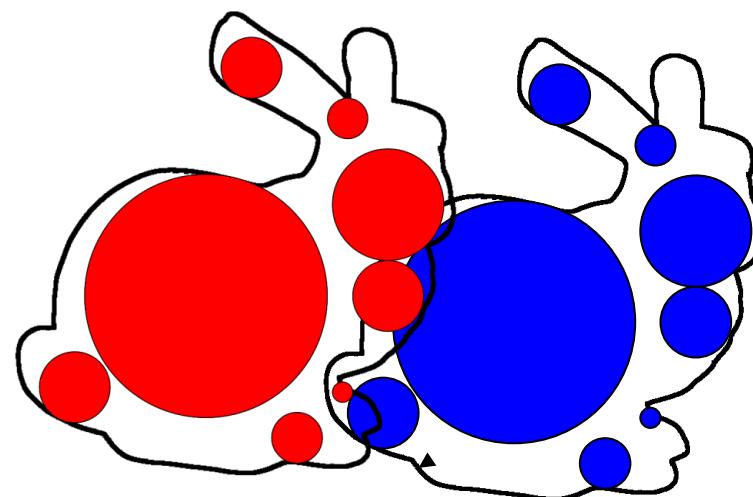
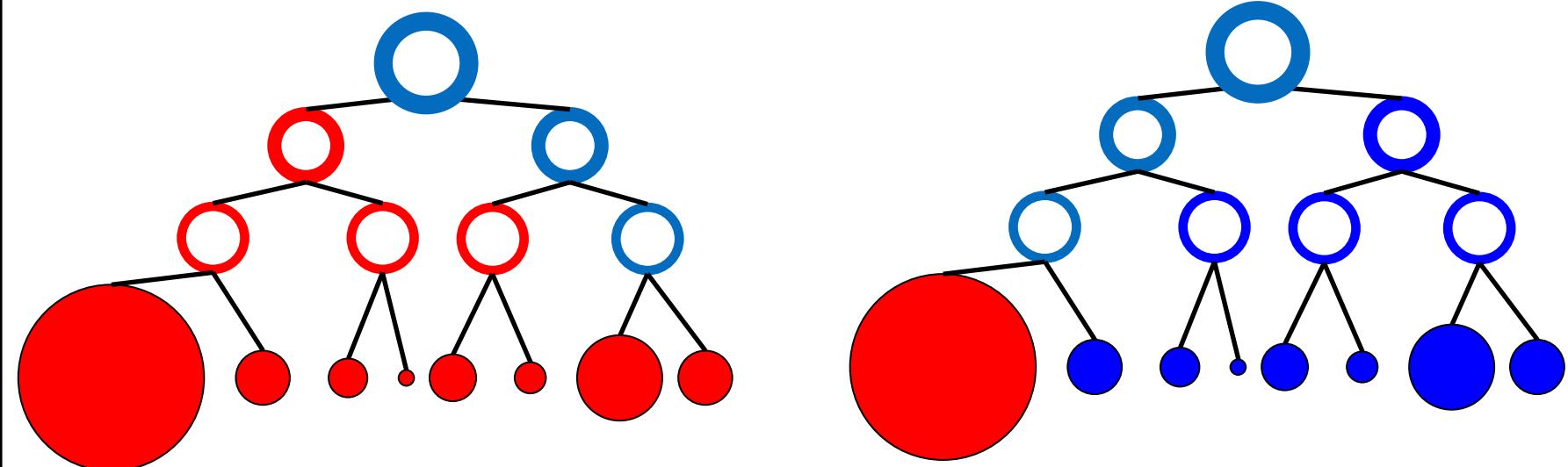


Penetration volume =  $v_1$

# BVH Traversal: Penetration Volume Queries

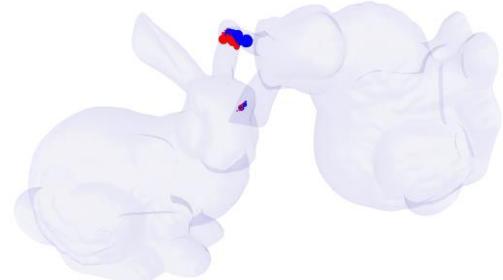
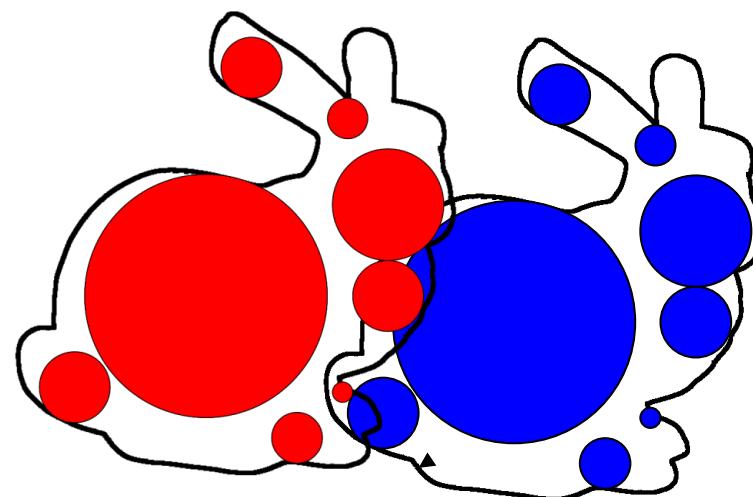
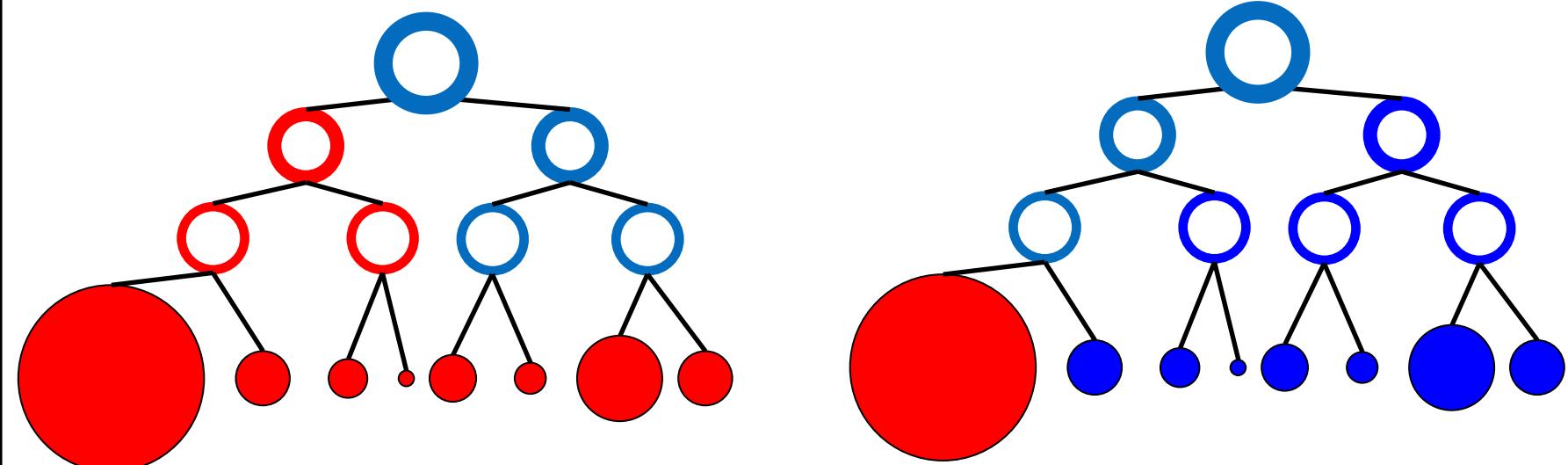


# BVH Traversal: Penetration Volume Queries



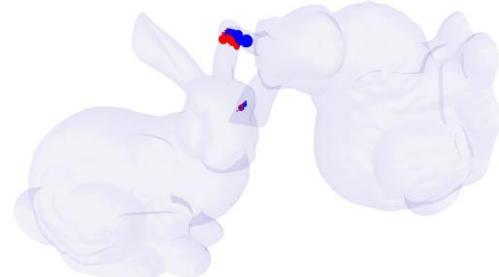
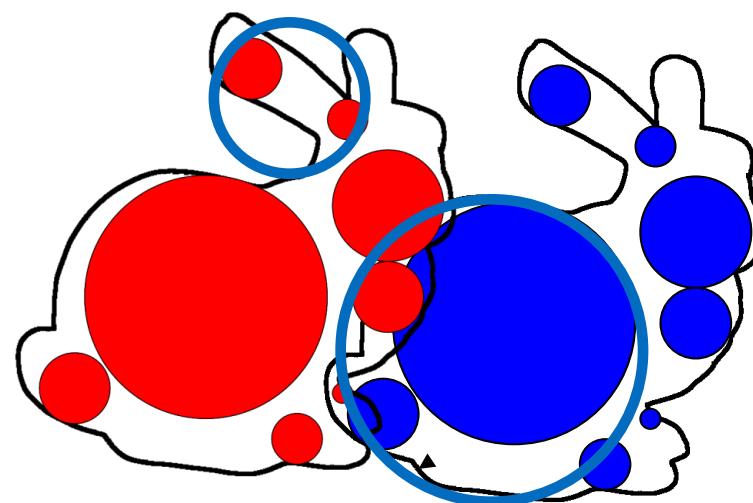
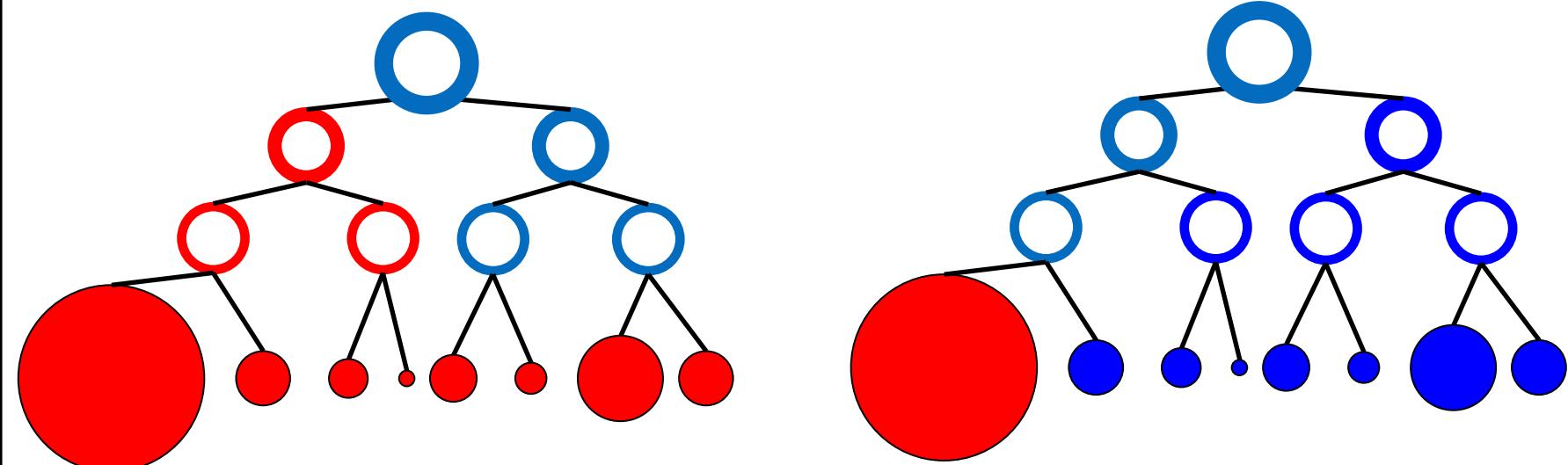
$$\text{Penetration volume} = v_1 + v_2$$

# BVH Traversal: Penetration Volume Queries



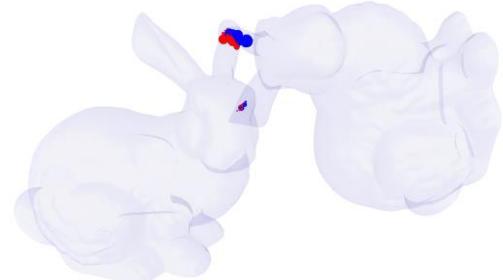
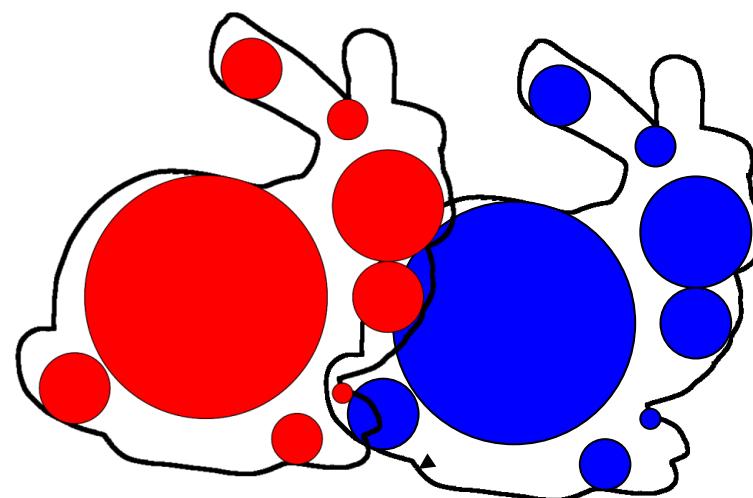
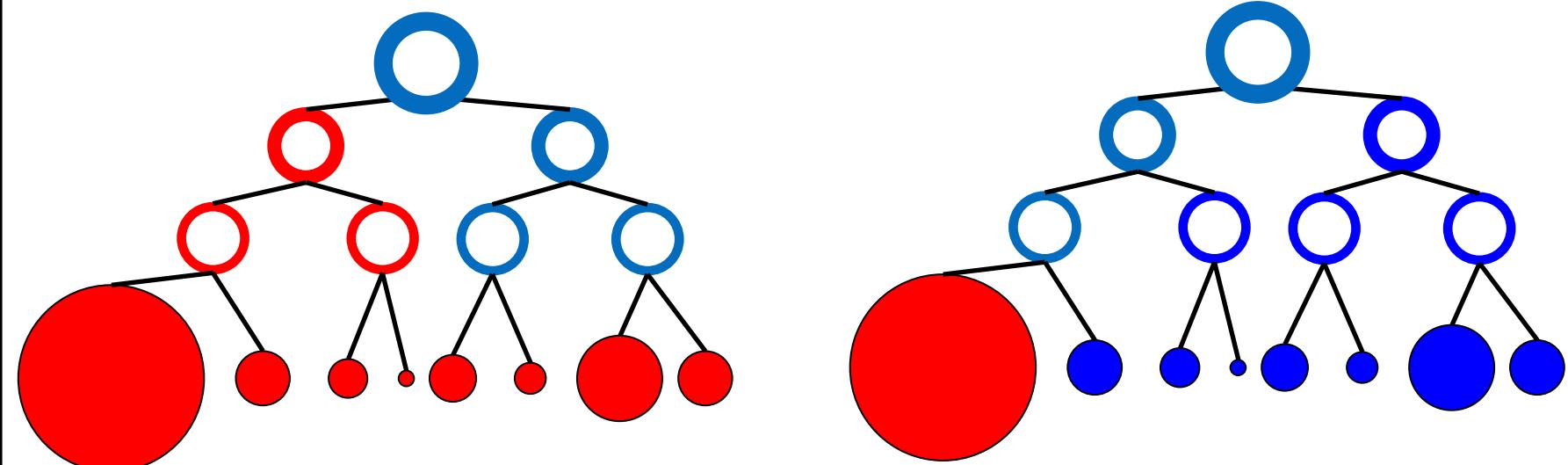
$$\text{Penetration volume} = v_1 + v_2$$

# BVH Traversal: Penetration Volume Queries



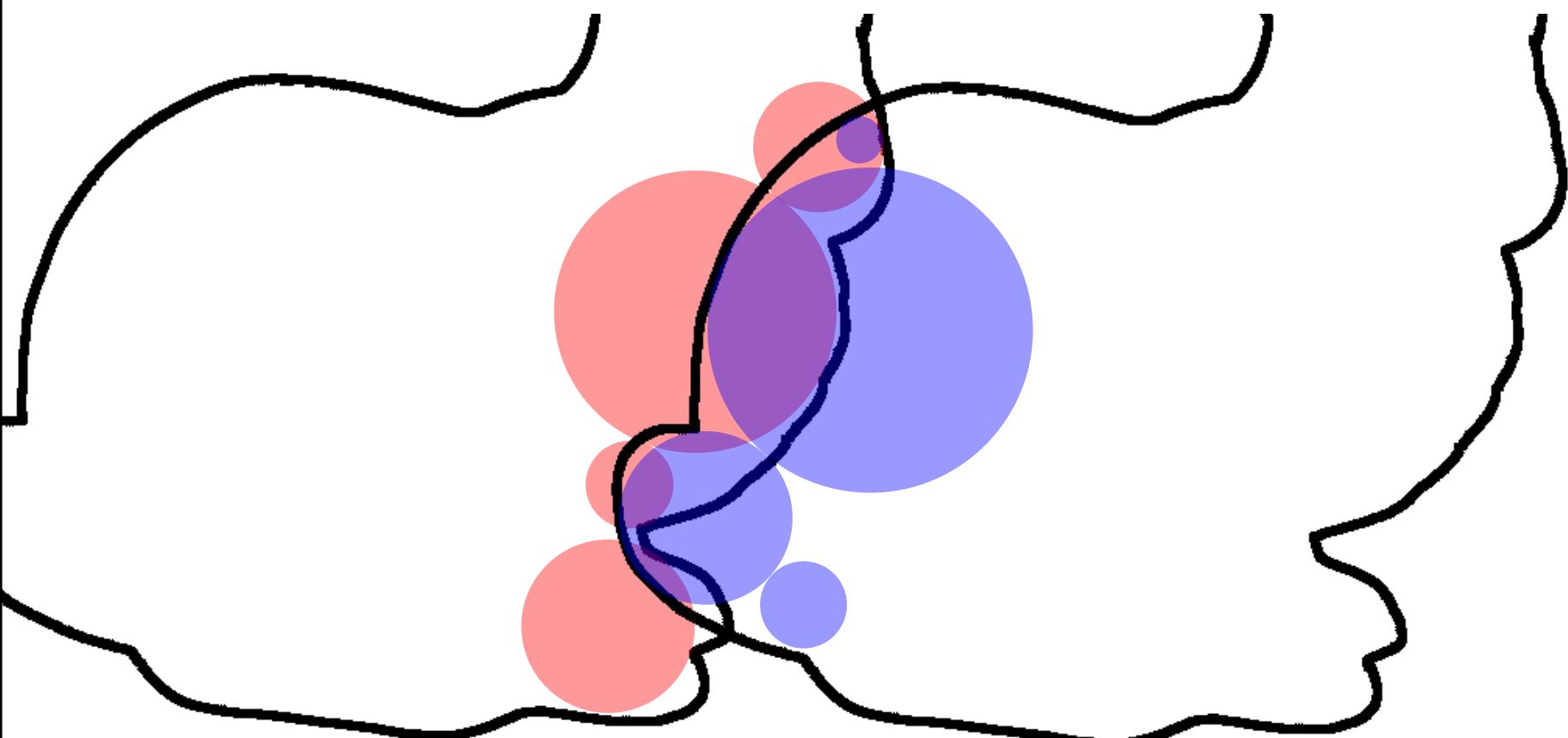
$$\text{Penetration volume} = v_1 + v_2$$

# BVH Traversal: Penetration Volume Queries

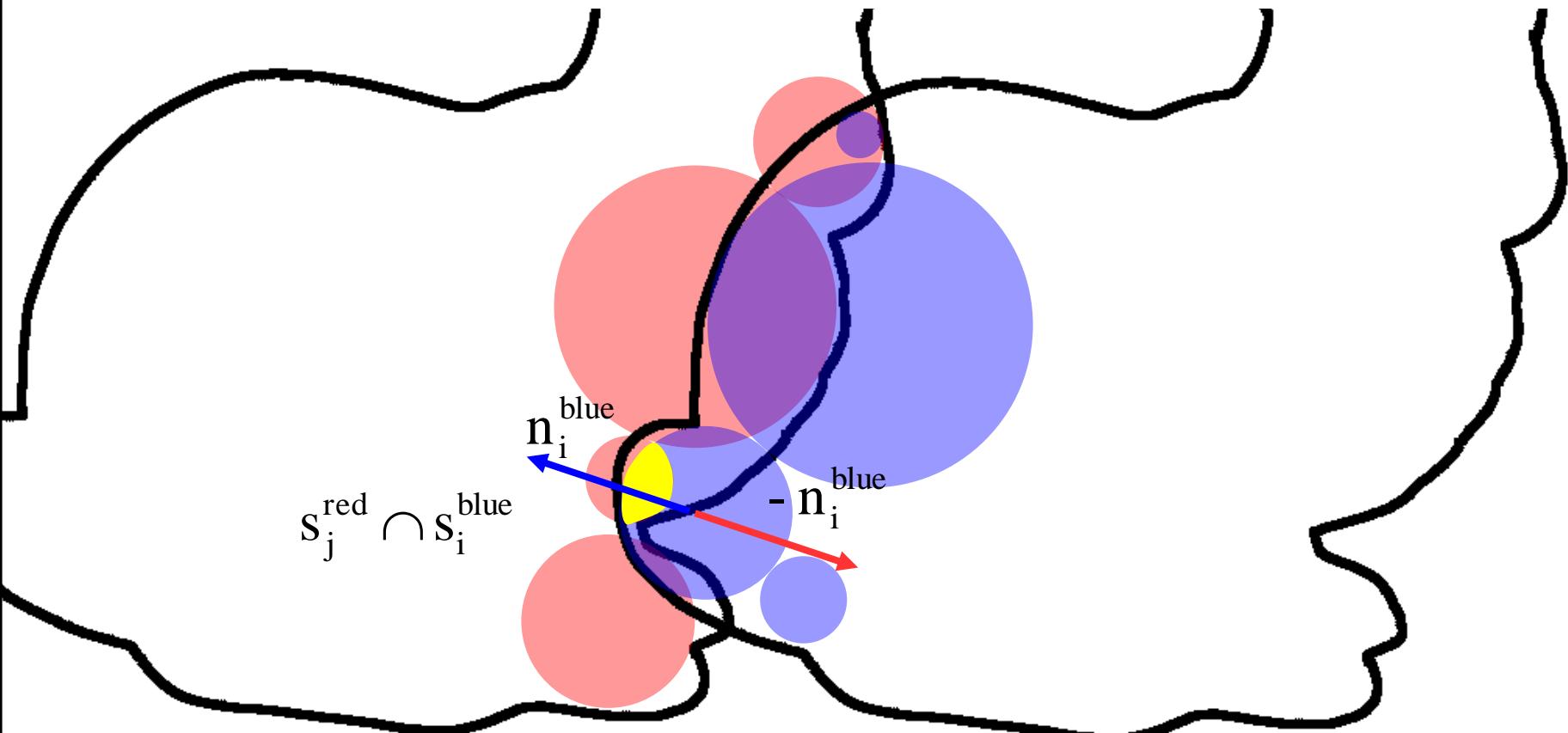


$$\text{Penetration volume} = v_1 + v_2$$

# Collision Response: Forces and Torques



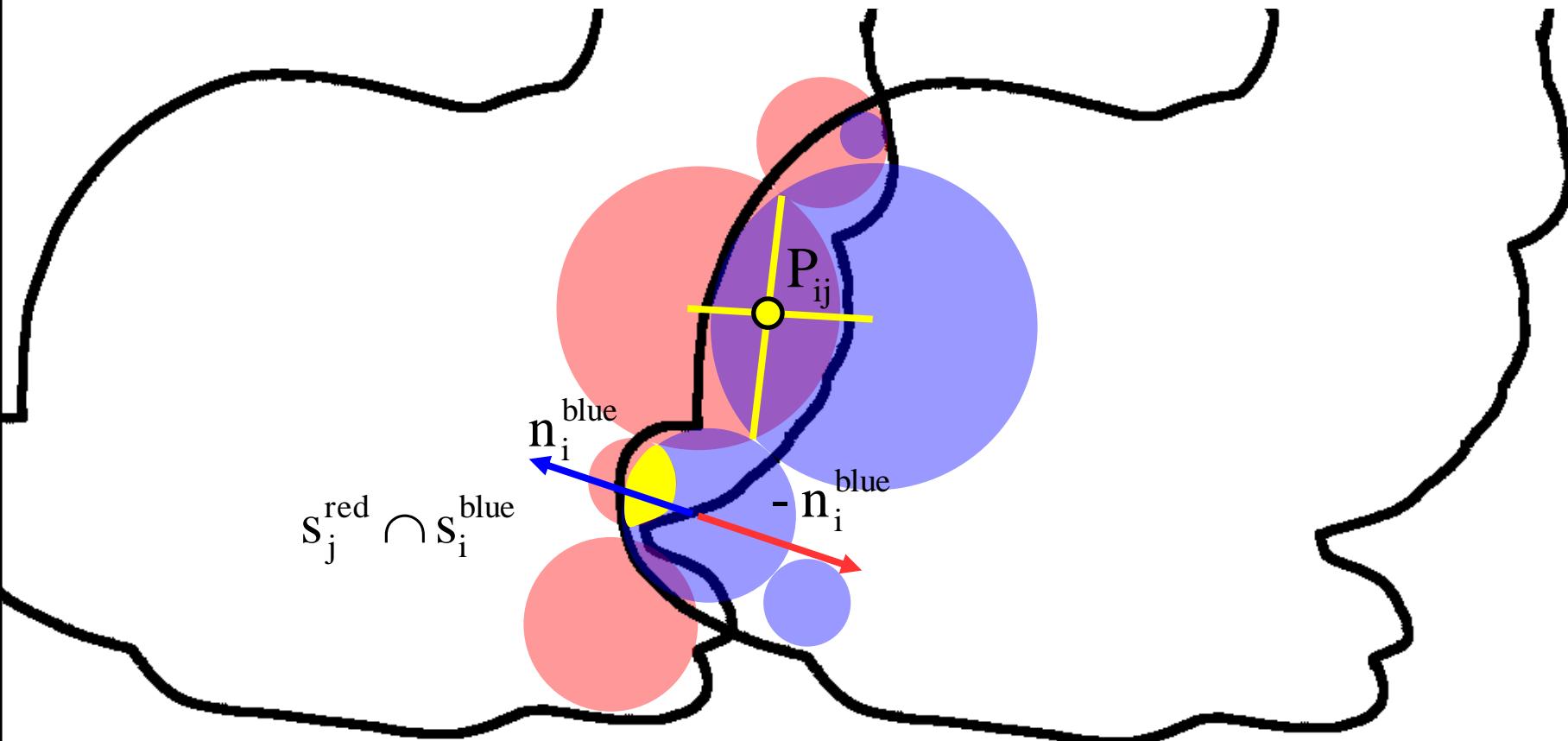
# Collision Response: Forces and Torques



$$f_{ij}^{\text{blue}} = (s_j^{\text{red}} \cap s_i^{\text{blue}})(-n_i^{\text{blue}})$$

$$f_{\text{total}}^{\text{blue}} = \sum f_{ij}^{\text{blue}}$$

# Collision Response: Forces and Torques



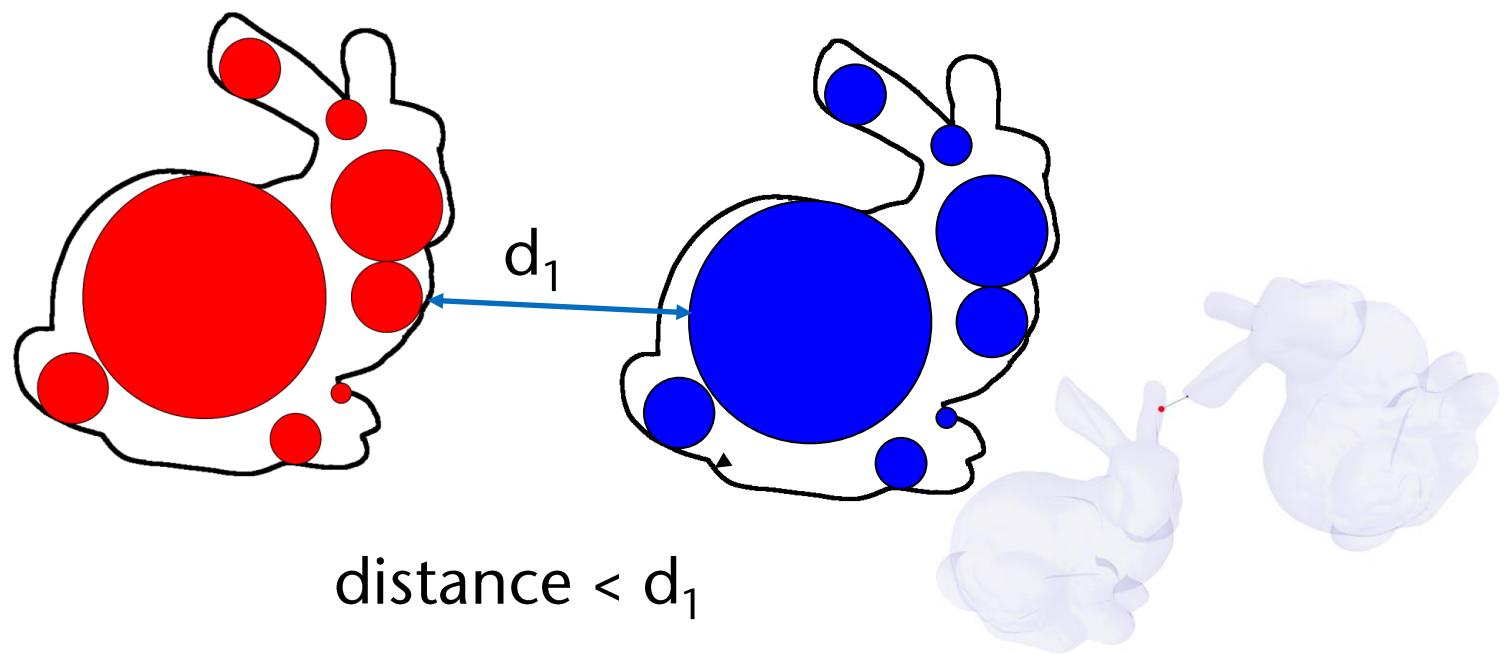
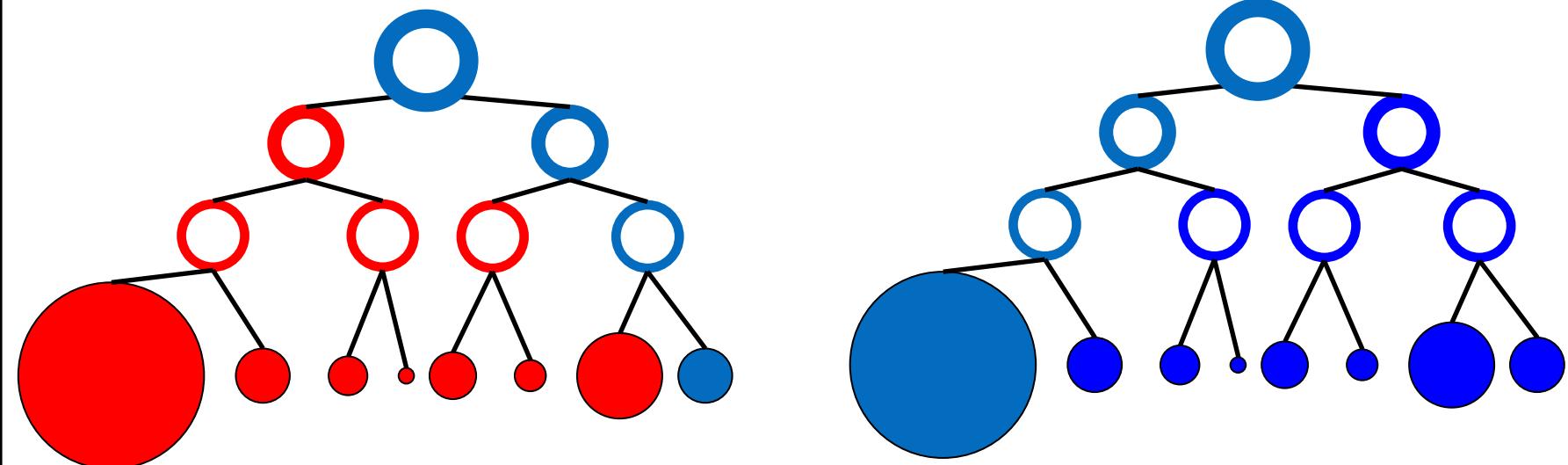
$$f_{ij}^{blue} = (s_j^{red} \cap s_i^{blue})(-n_i^{blue})$$

$$\tau_{ij}^{blue} = (P_{ij} - C_m) \times (f_{ij}^{blue})$$

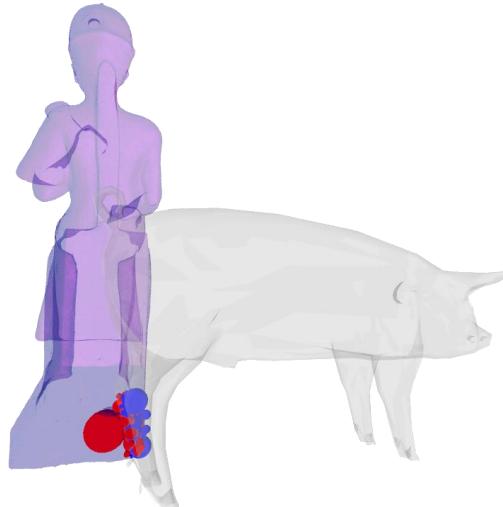
$$f_{total}^{blue} = \sum f_{ij}^{blue}$$

$$\tau_{total}^{blue} = \sum \tau_{ij}^{blue}$$

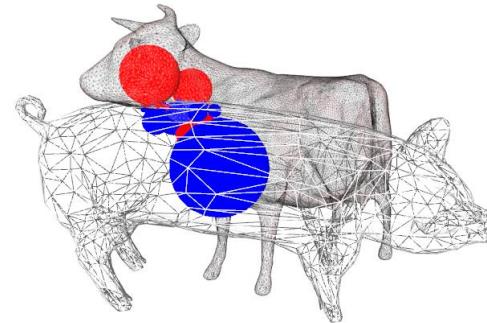
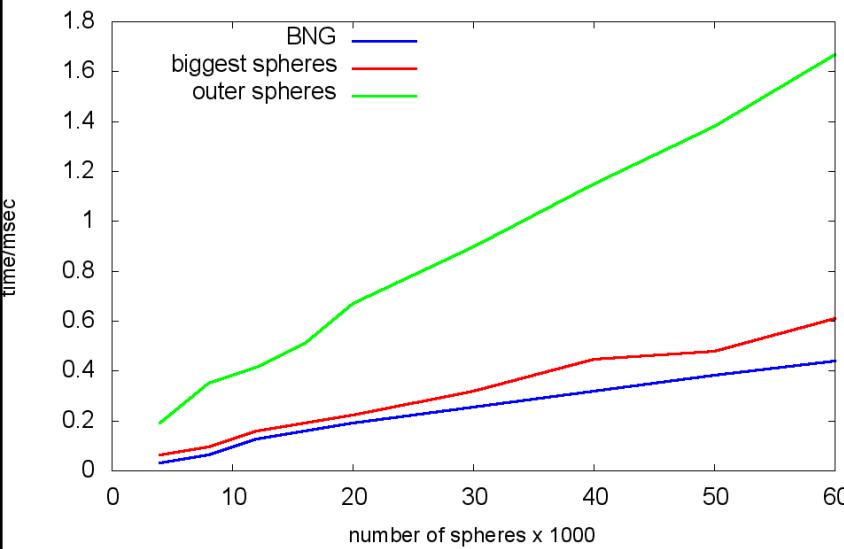
# BVH Traversal: Proximity Queries



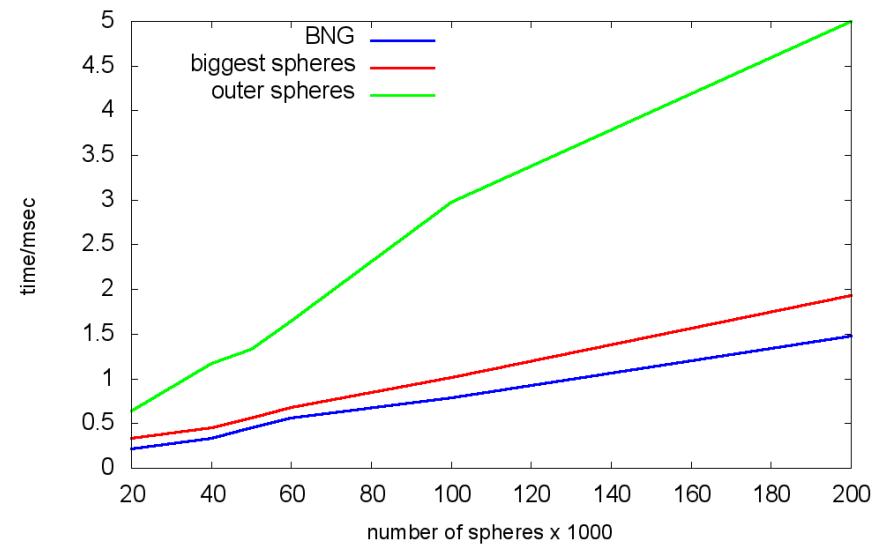
# Results: Runtime Performance



collision test between pig and statue

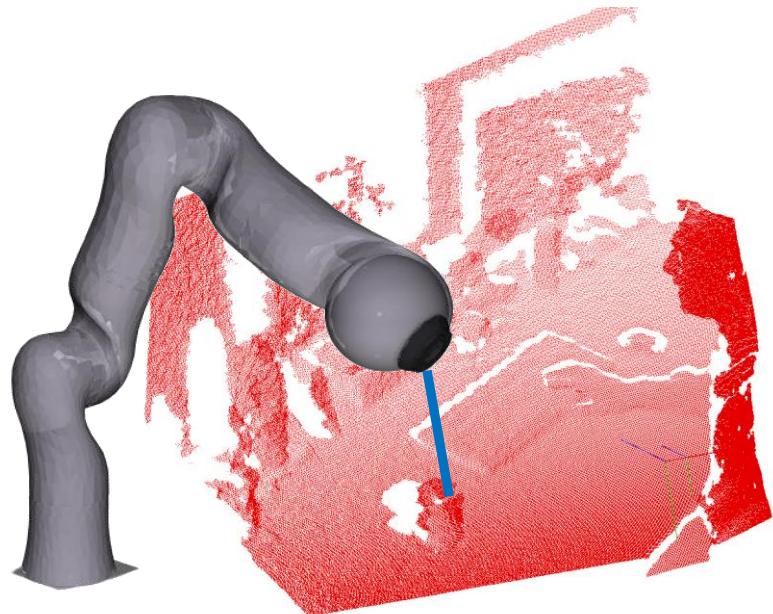


collision test between pig and cow



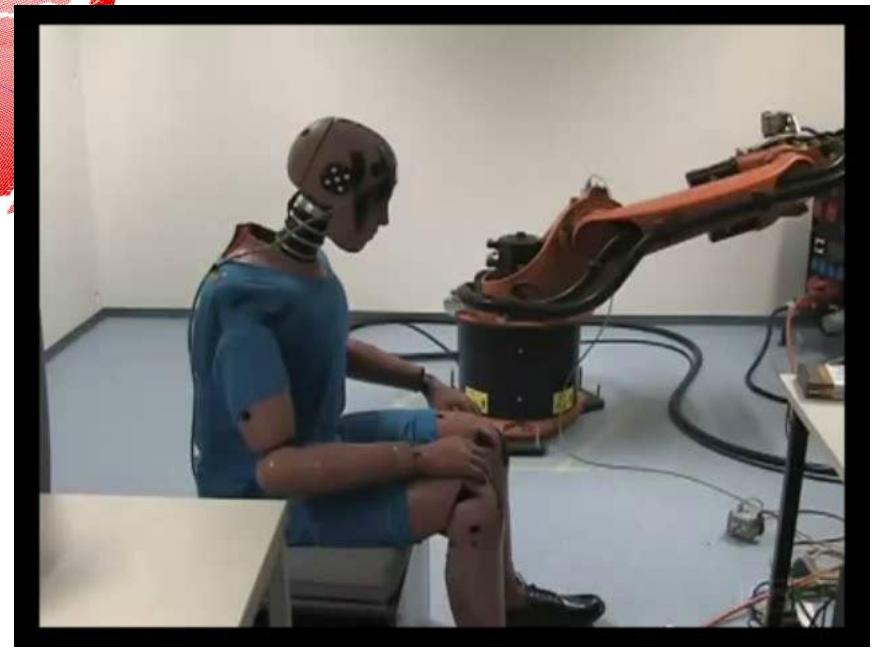
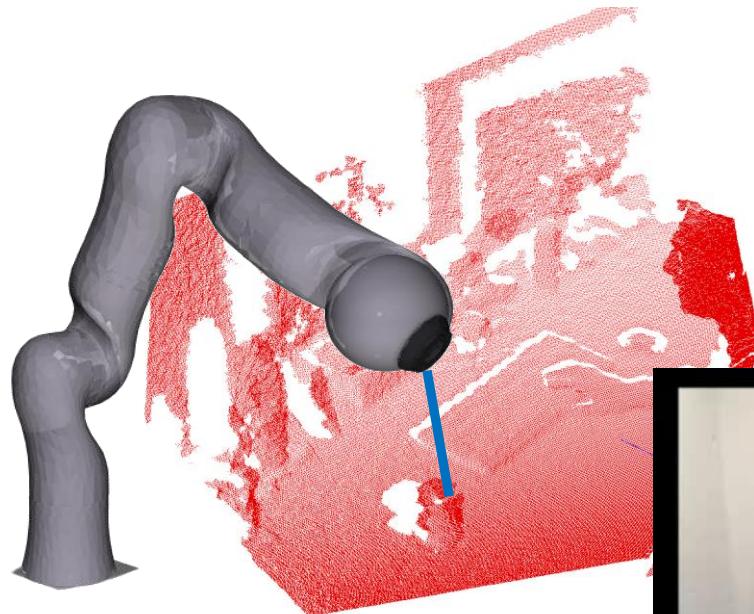
# Motivation: Other Object Representations

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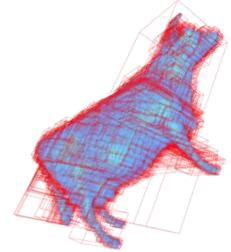
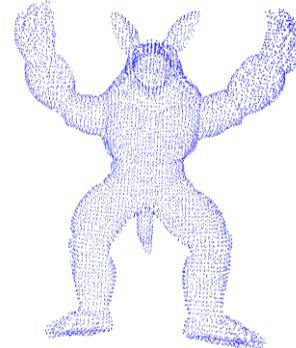




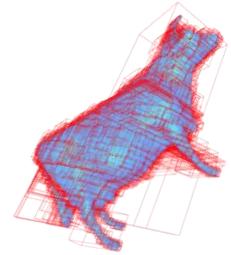
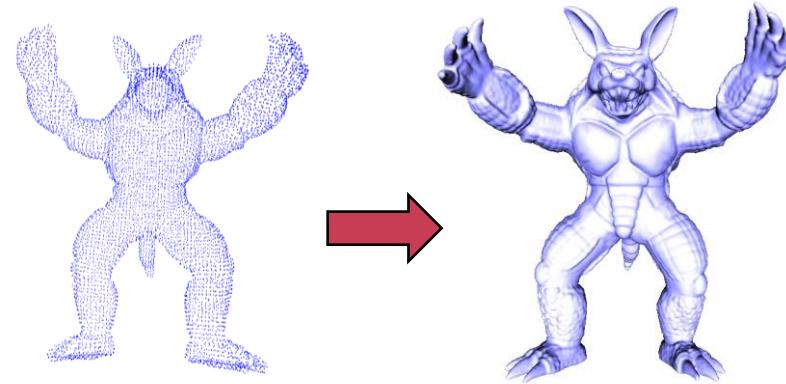
# Motivation: Other Object Representations



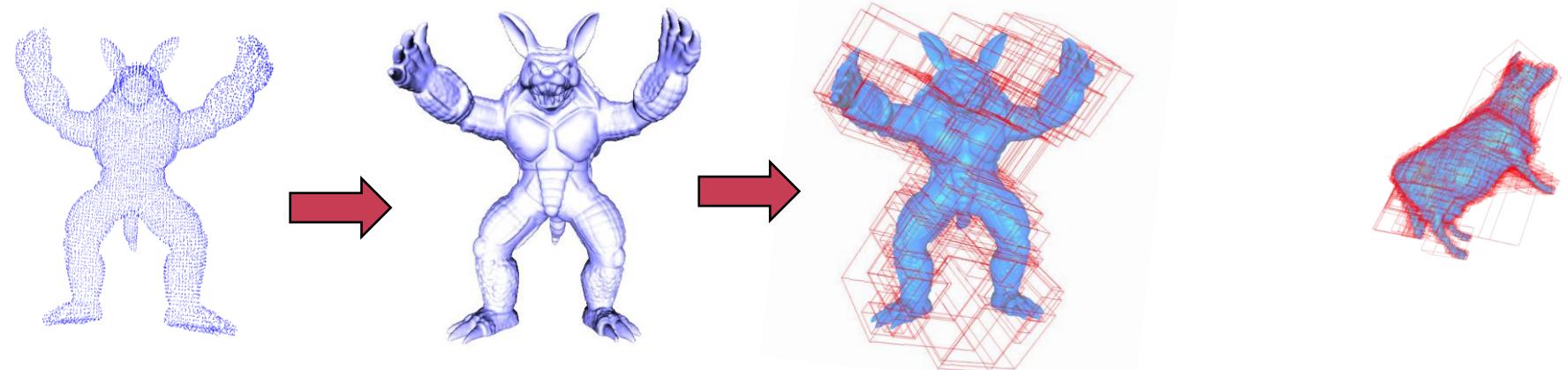
# Previous Works



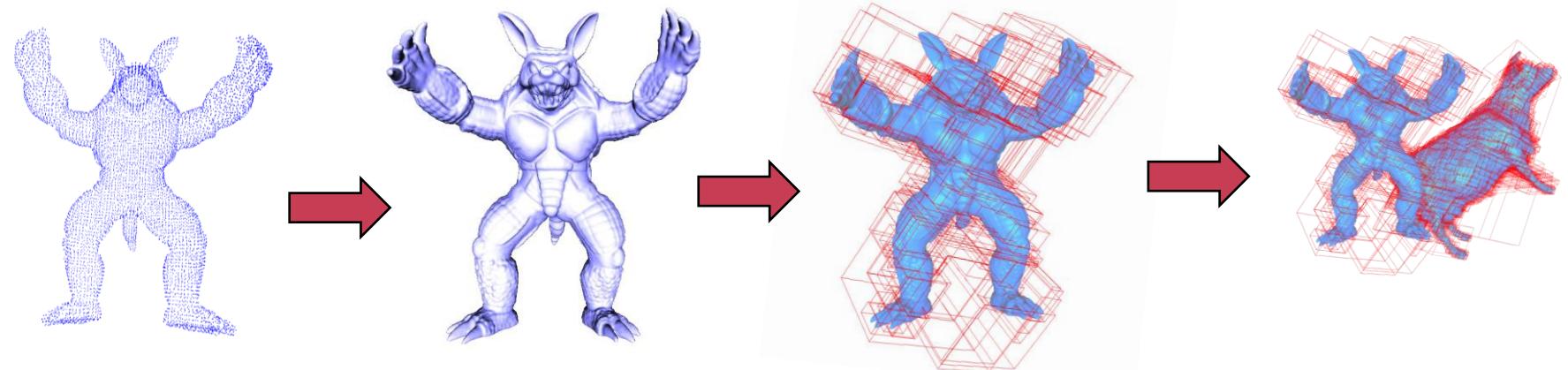
# Previous Works



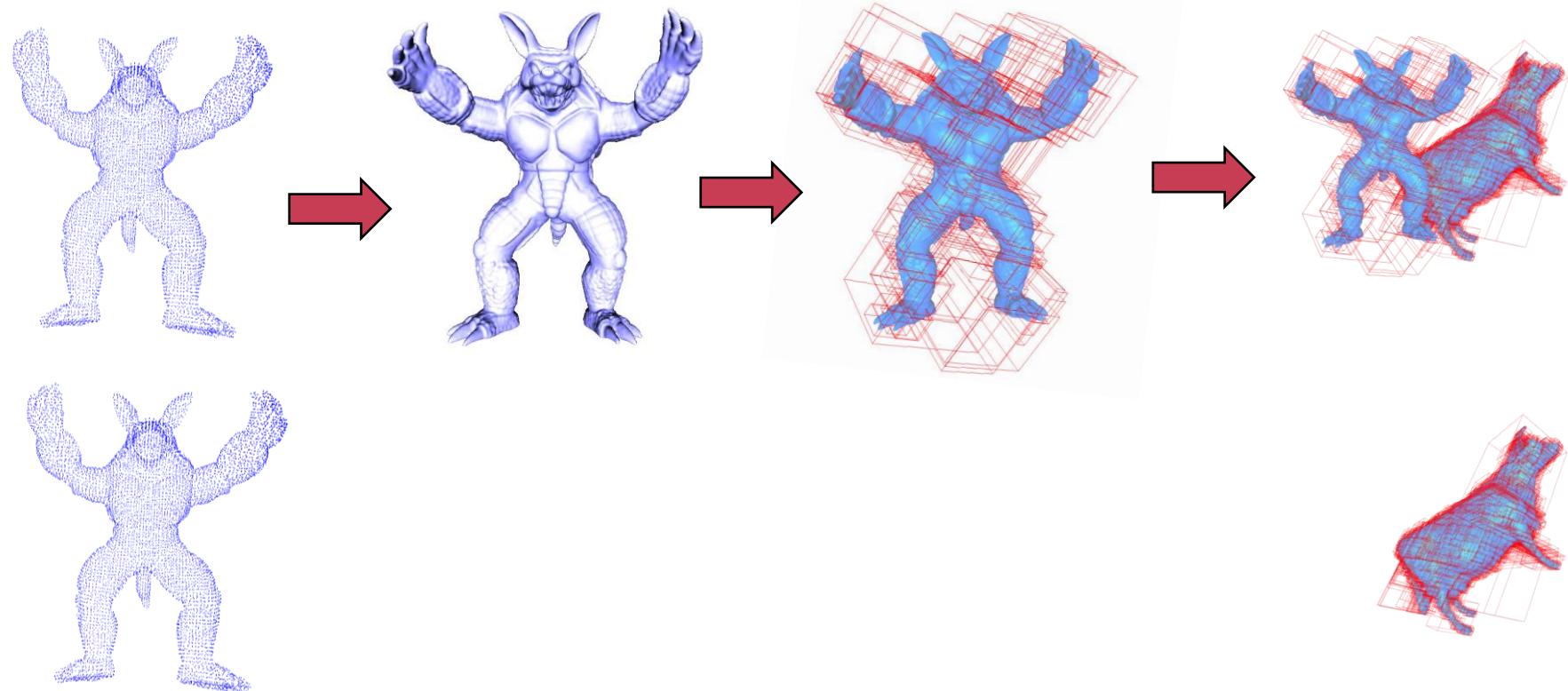
# Previous Works



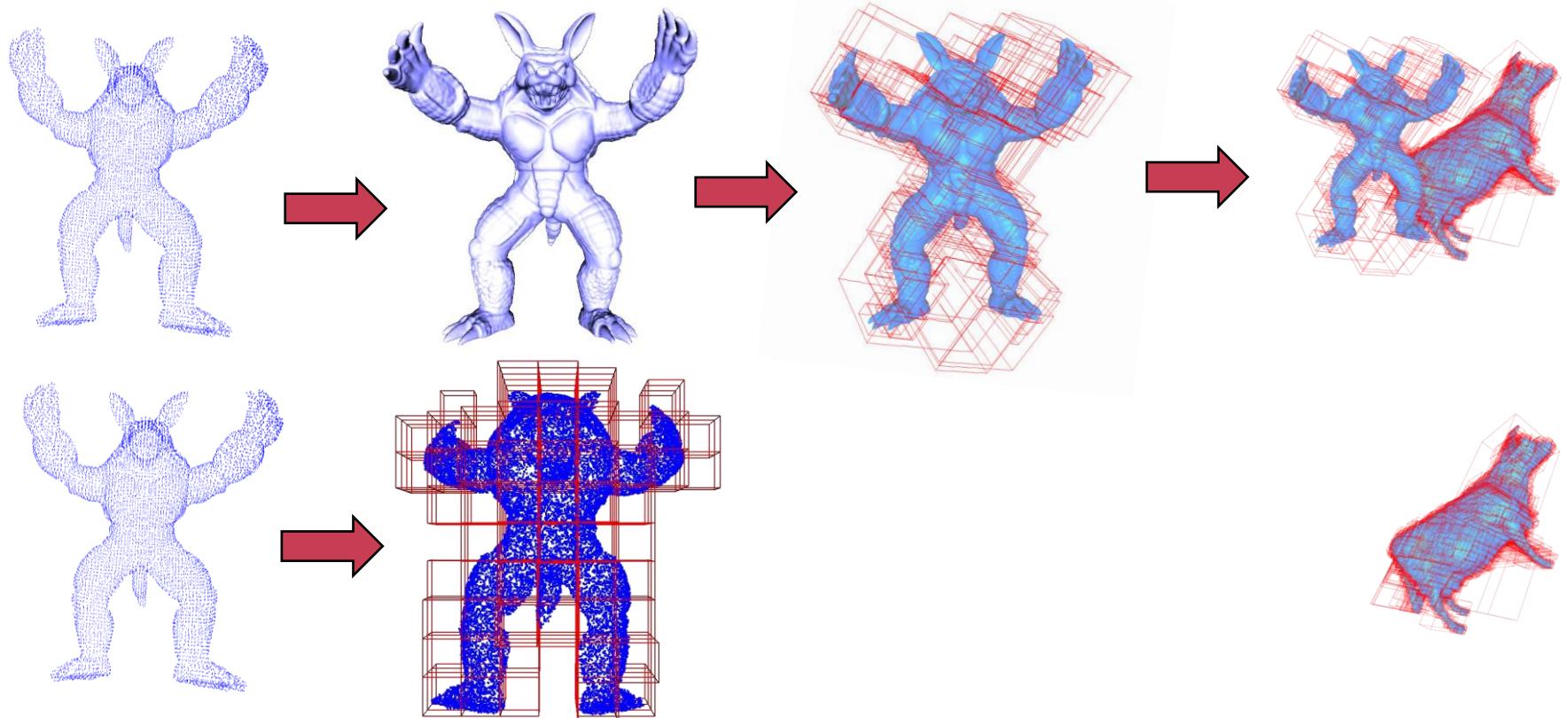
# Previous Works



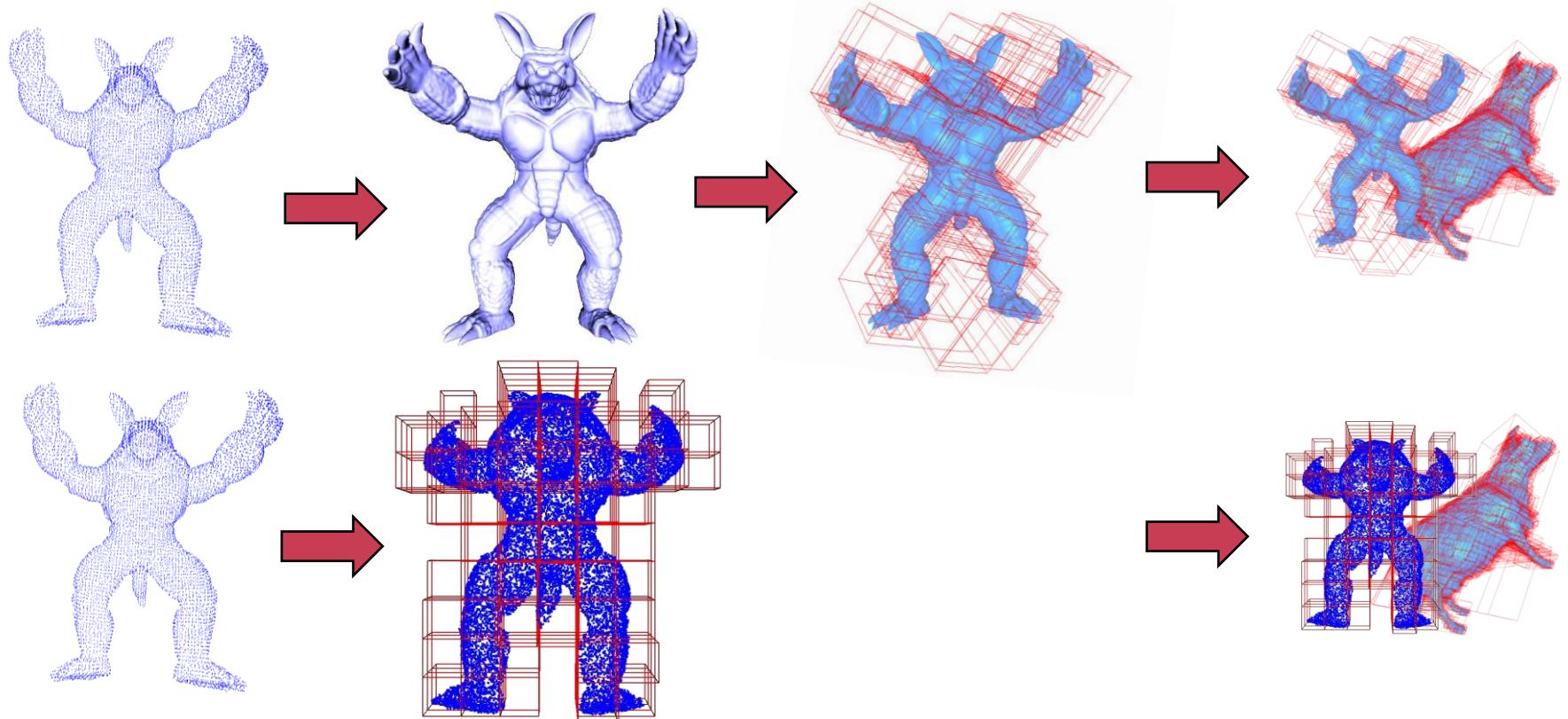
# Previous Works



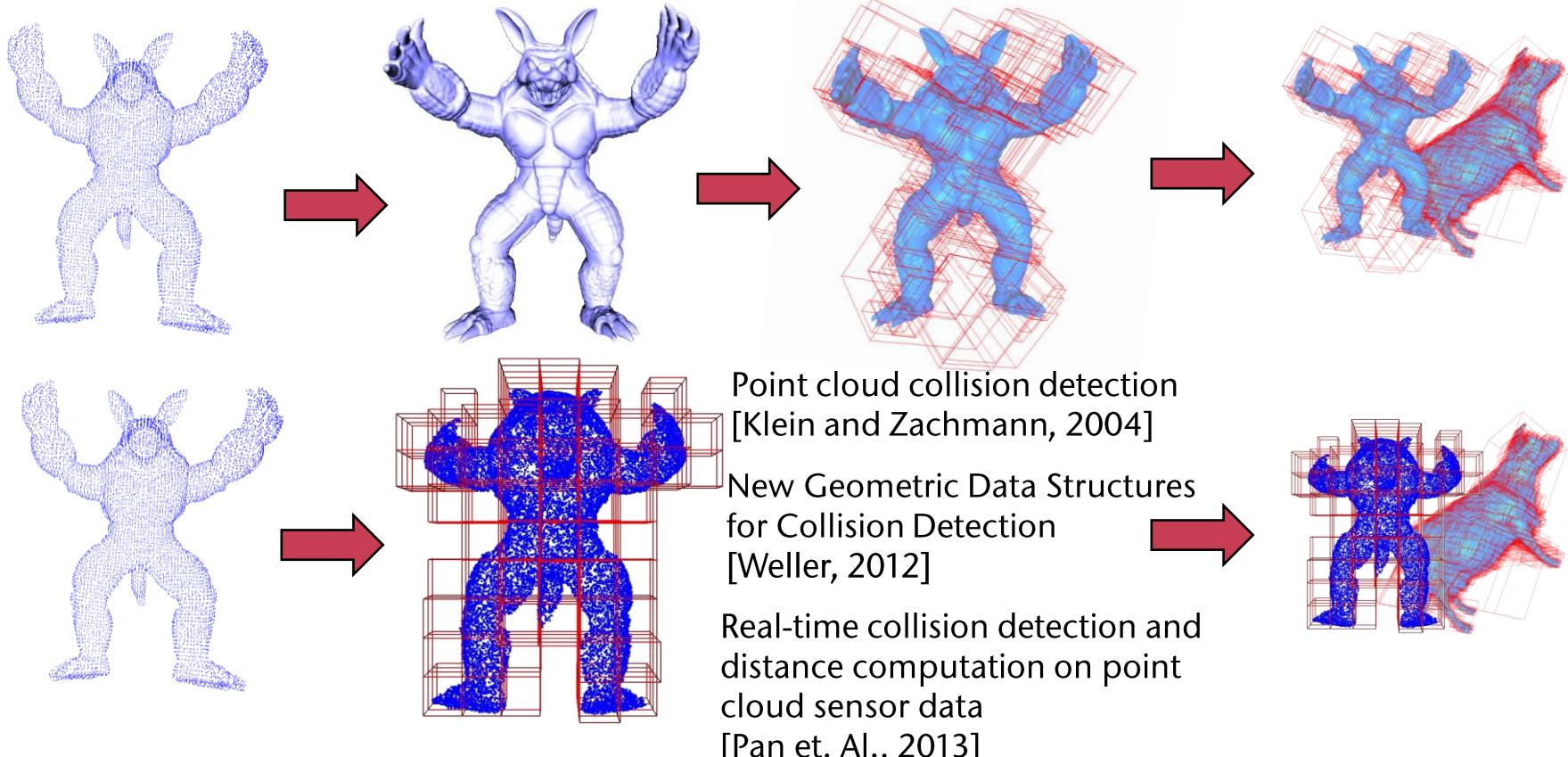
# Previous Works



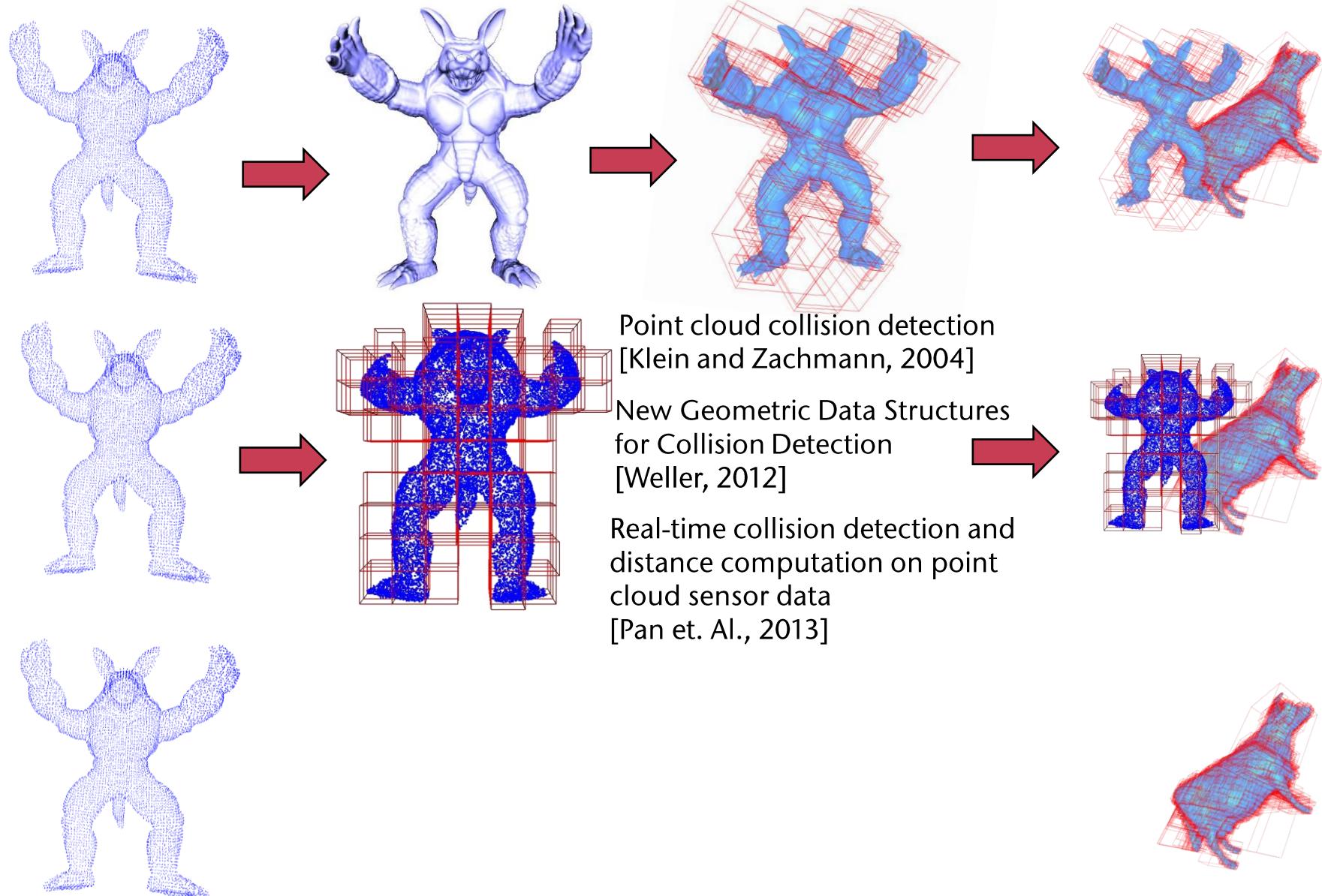
# Previous Works



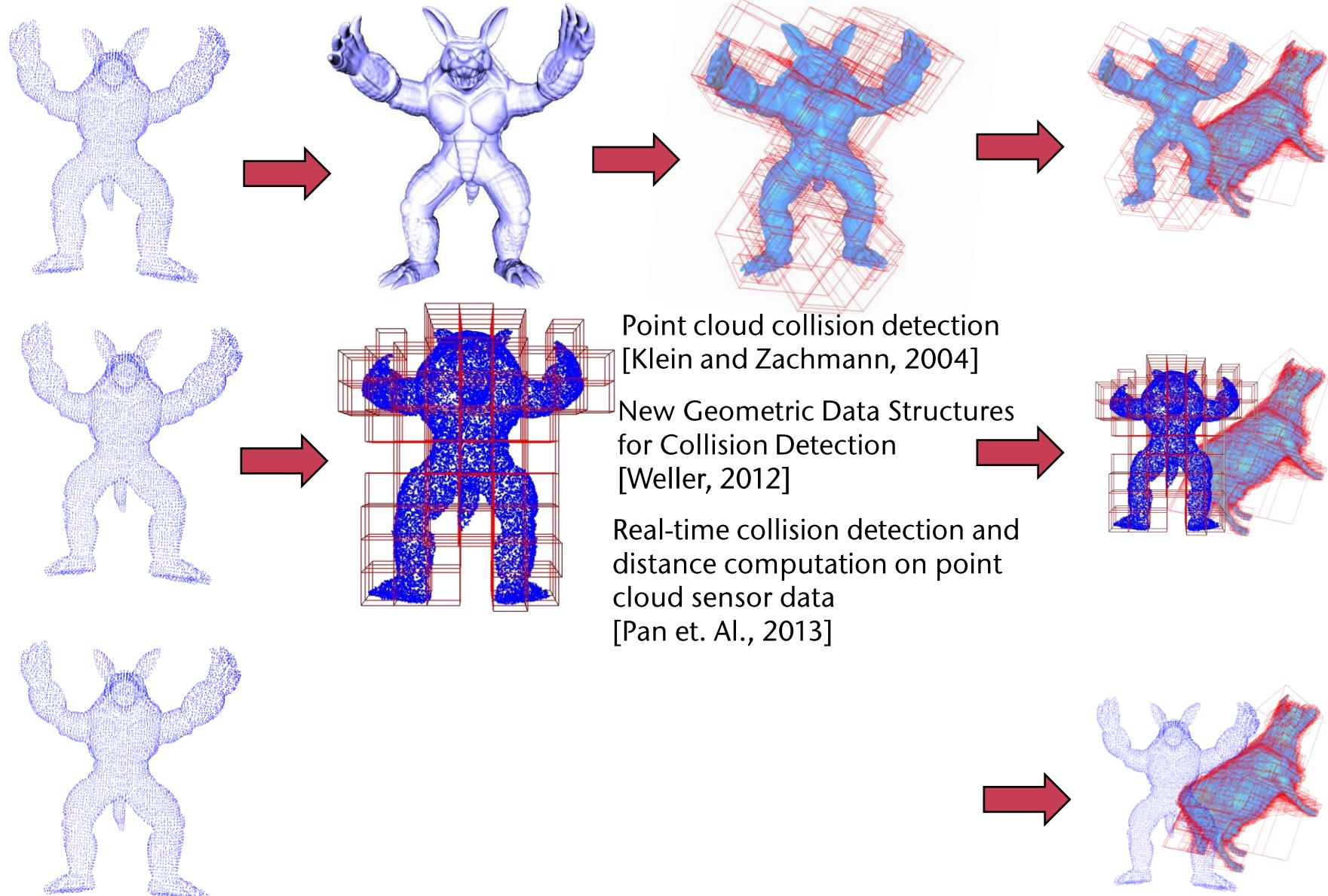
# Previous Works



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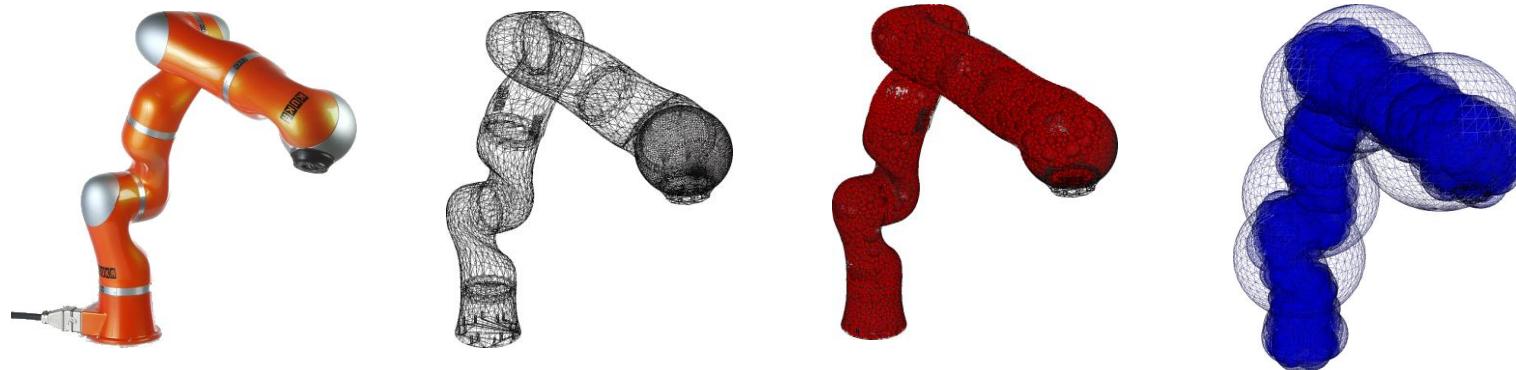


# Previous Works



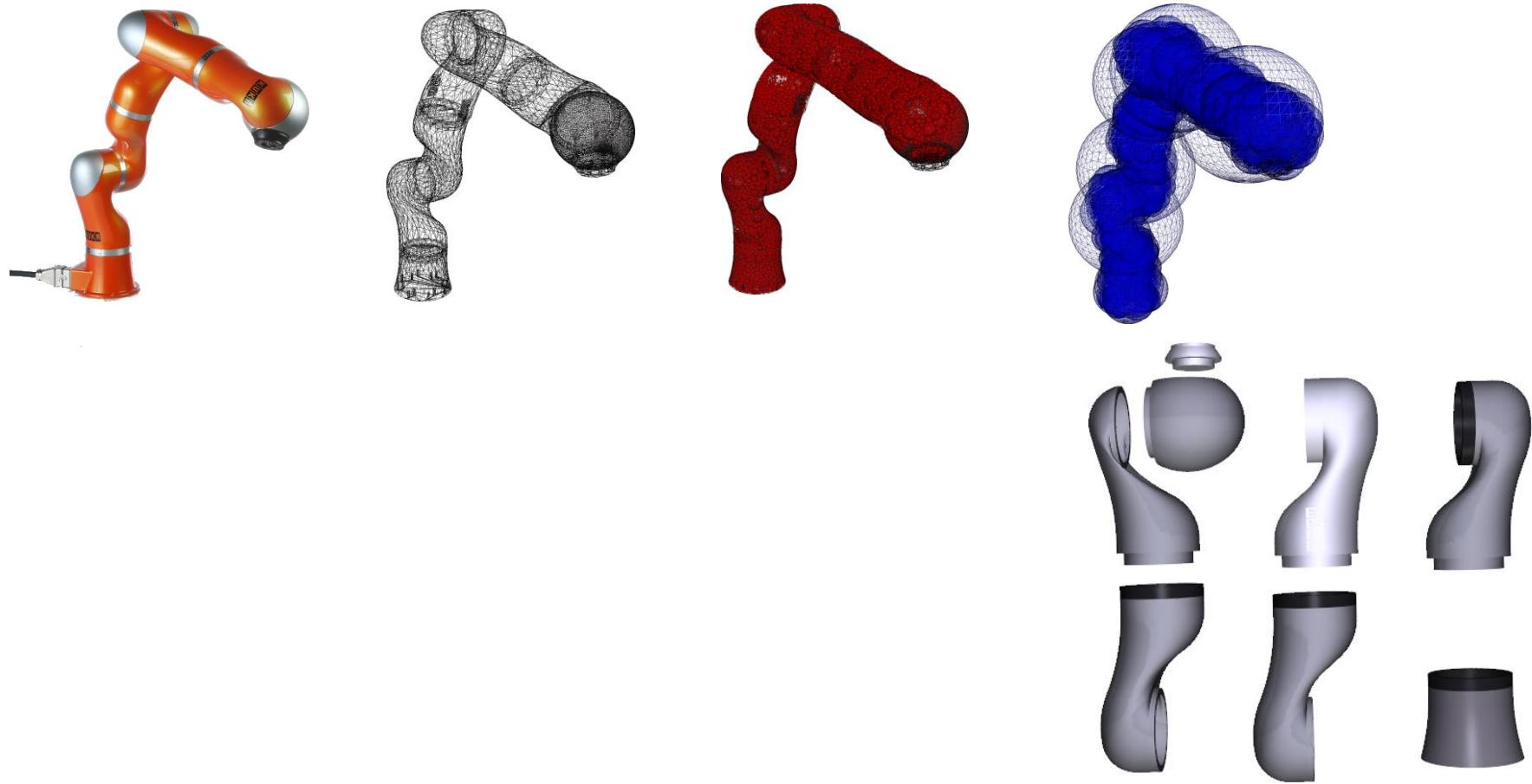
# Precondition

- Polygonal object representation: Inner Sphere Trees (ISTs)



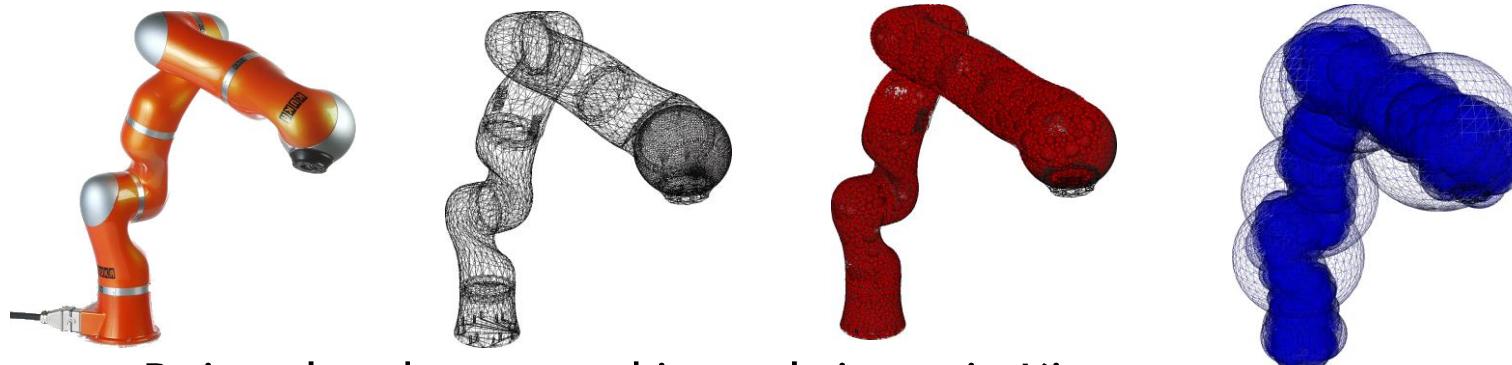
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- Polygonal object representation: Inner Sphere Trees (ISTs)

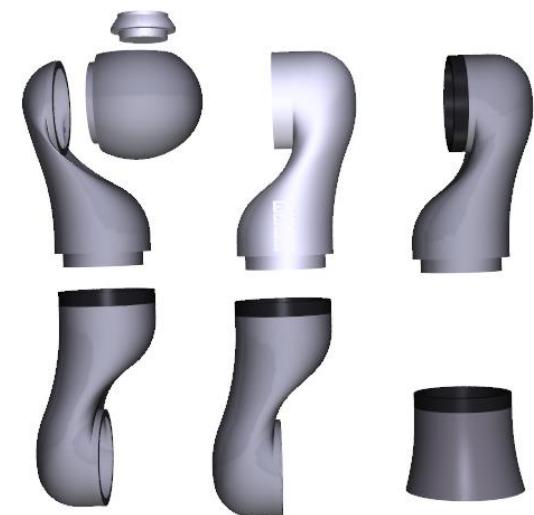
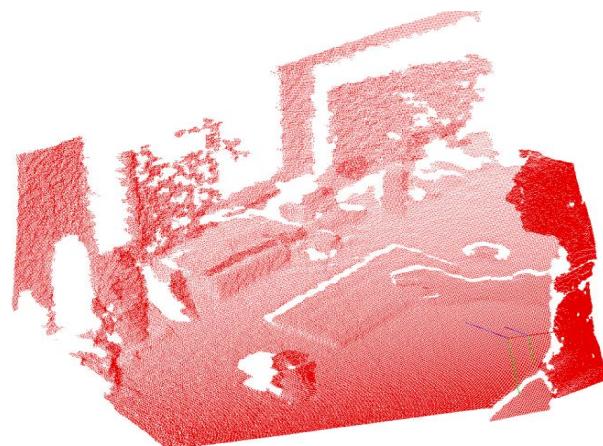


# Precondition

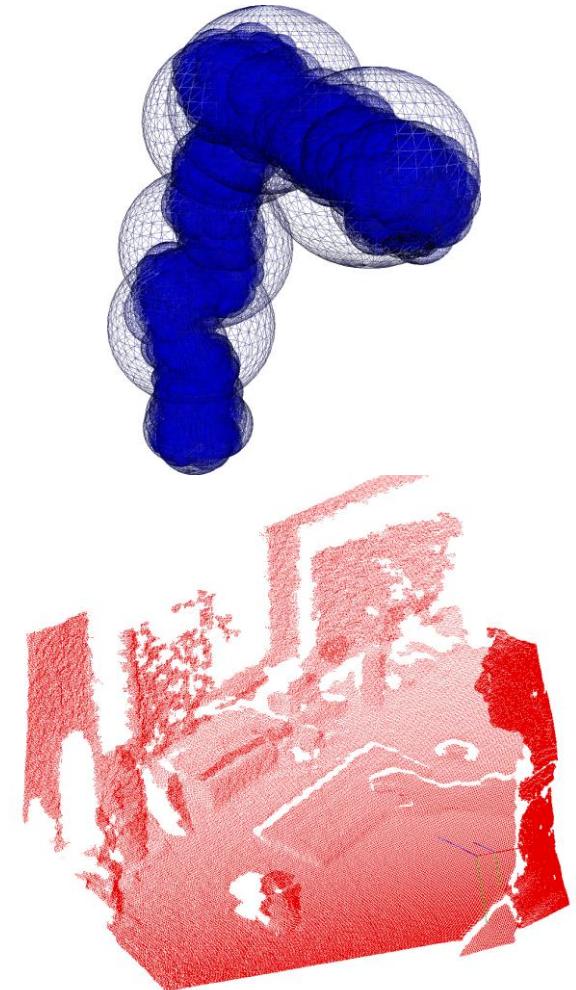
- Polygonal object representation: Inner Sphere Trees (ISTs)



- Point cloud captured in real-time via Kinect



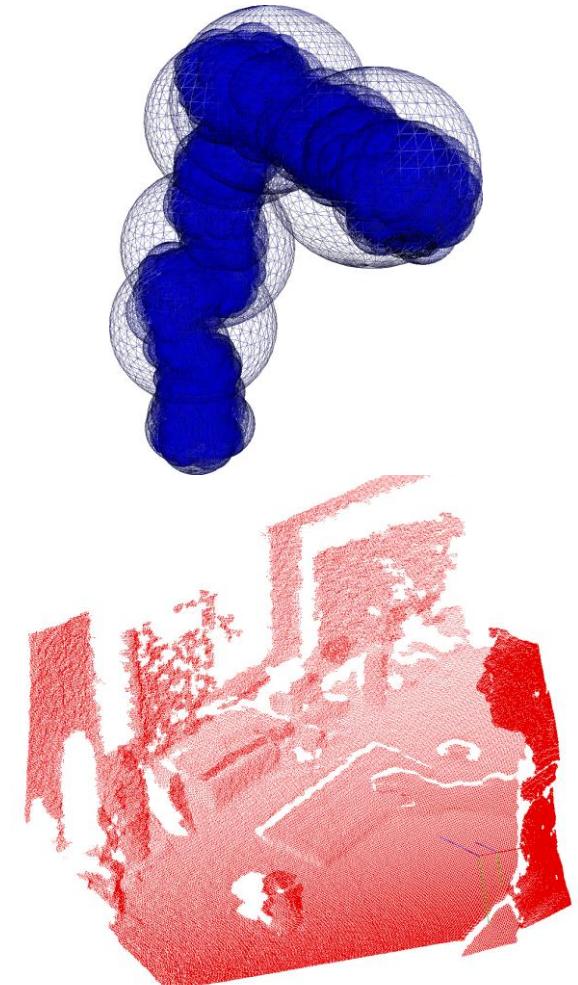
# Basic Algorithm





# Basic Algorithm

```
minDist = ∞  
For each IST ∈ Robot  
  For each point p ∈ Point Cloud  
    getDistance( Root(IST) , p, minDist)
```

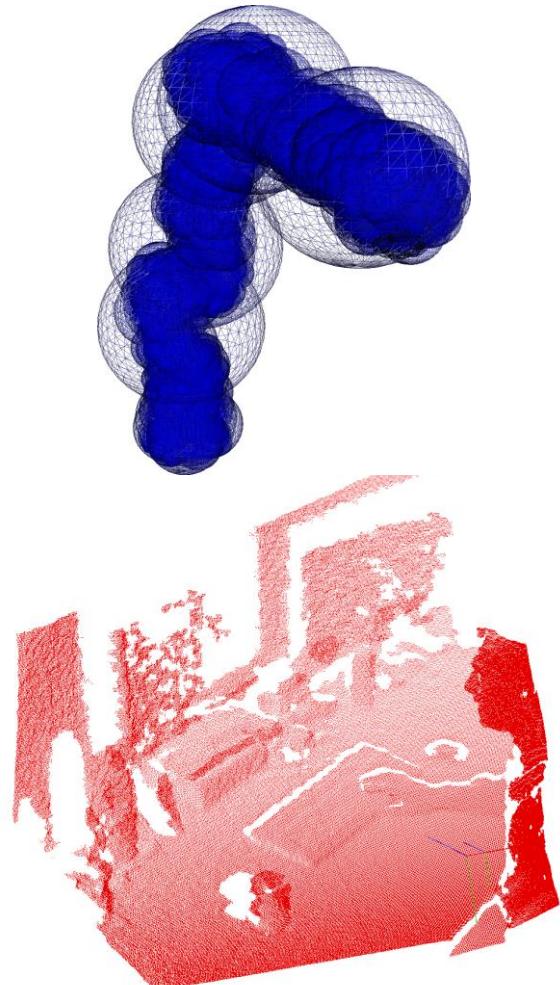




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For each IST ∈ Robot  
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        getDistance( Root(IST) , p , minDist )
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```
getDistance( Sphere s, Point p, d )  
forall the Children sc of s do  
    d = distance( sc, p )  
    if d < minDist then  
        getDistance( sc, p, d )
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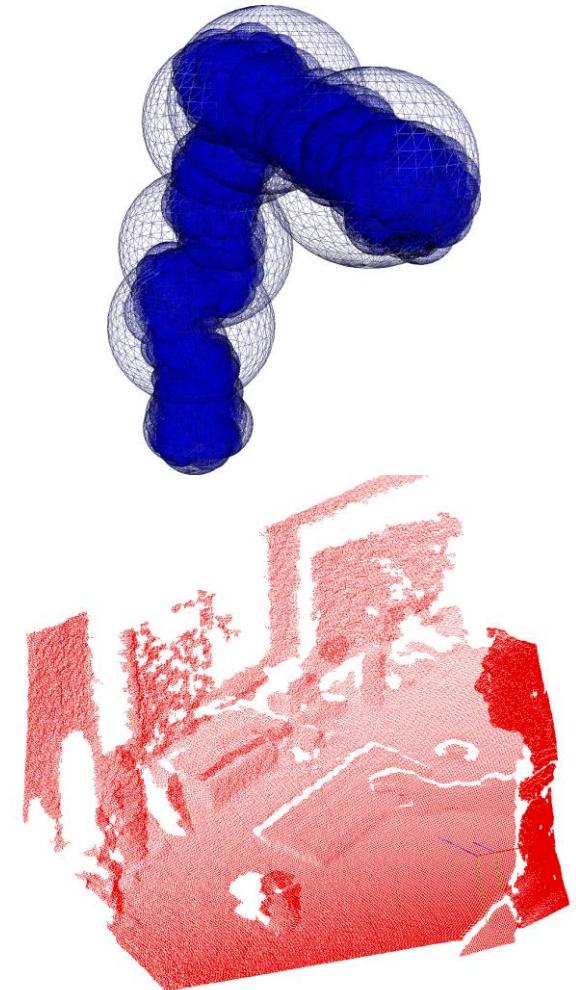
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forall the Children sc of s do
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  if s is Leaf then
    minDist = min( d, minDist )
  
```





# Parallel Algorithm

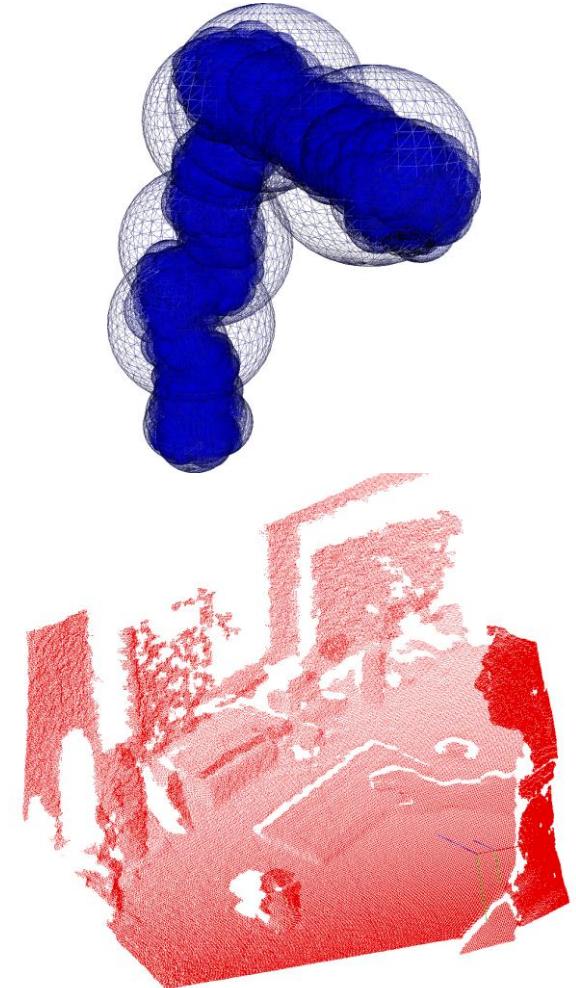


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# Parallel Algorithm

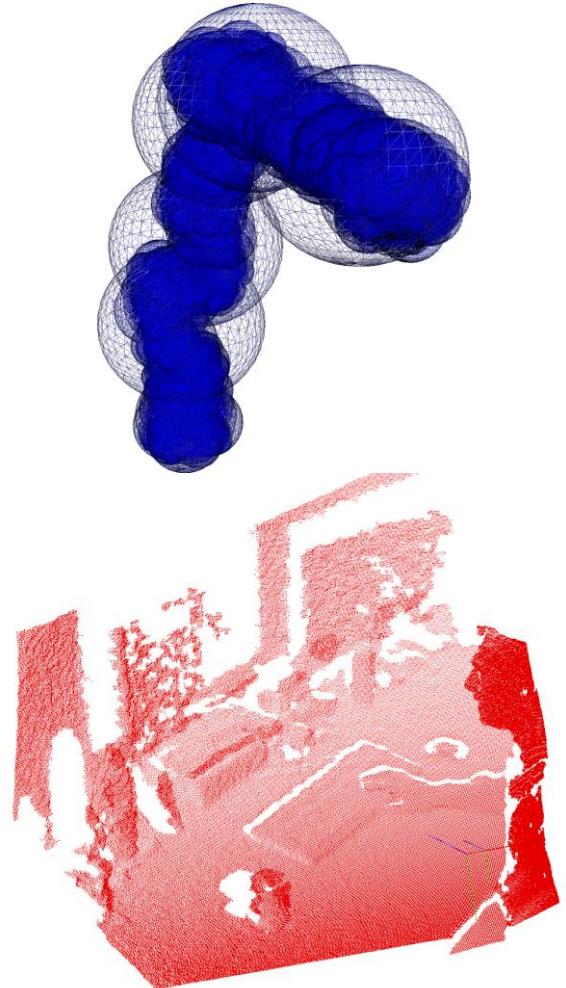


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# Parallel Algorithm



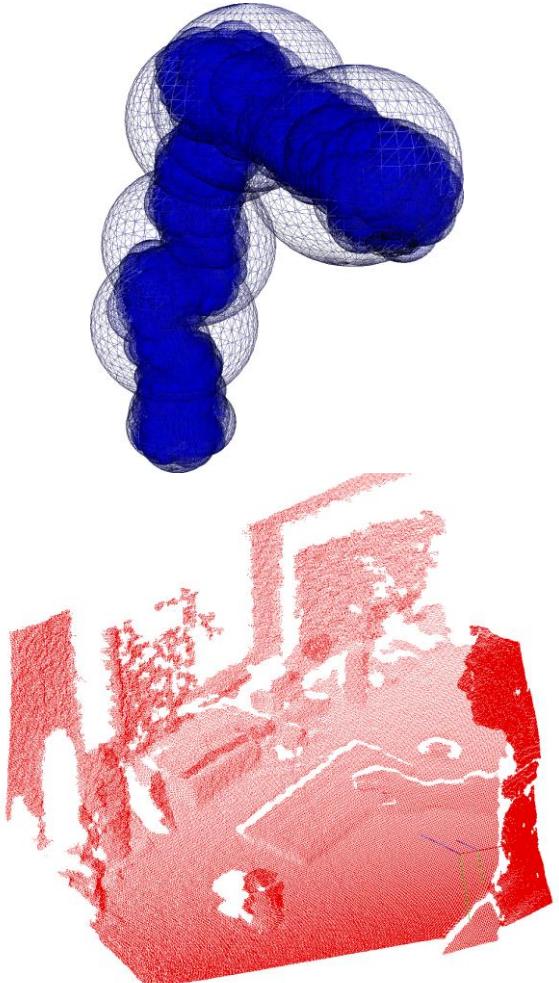
```
minDist =  $\infty$ 
```

*In Parallel ISTs  $\in$  Robot:*

For each point  $p \in$  Point Cloud

```
getDistance( Root(IST), p, minDist)
```

```
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# Parallel Algorithm



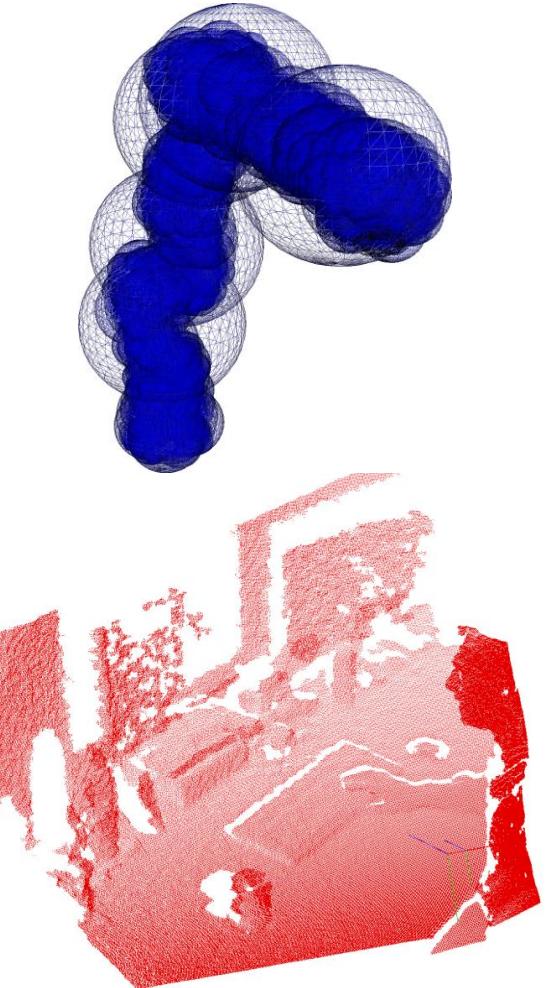
```
minDist =  $\infty$ 
```

```
In Parallel ISTs  $\in$  Robot:
```

```
For each point  $p \in$  Point Cloud
```

```
getDistance( Root(IST), p, minDist)
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# Parallel Algorithm



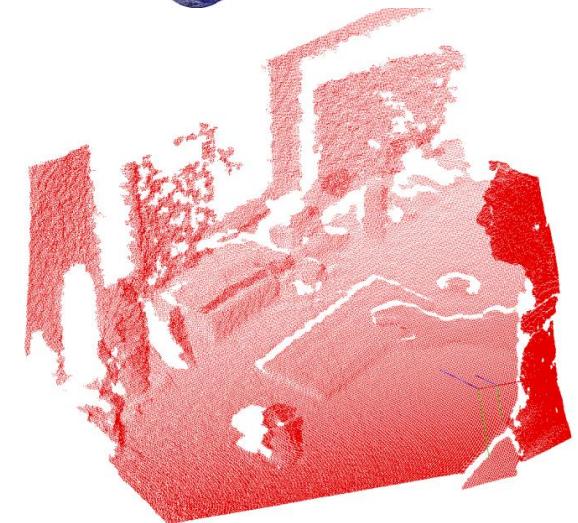
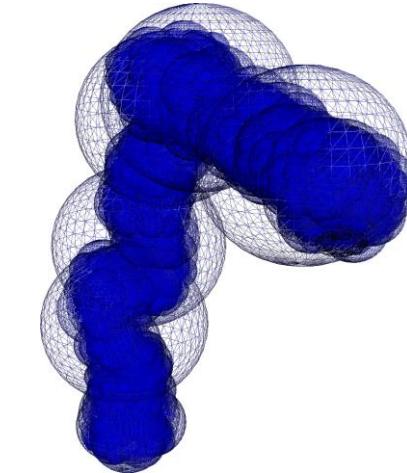
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*In Parallel* point p  $\in$  Point Cloud:

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getDistance( Root(IST), p, minDist)
```

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```





# Parallel Algorithm



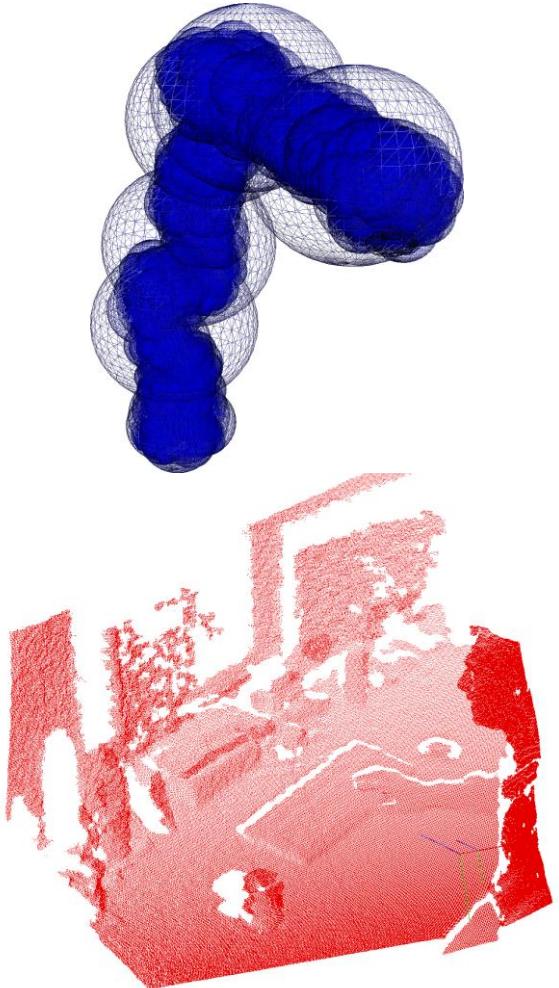
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```





# Parallel Algorithm



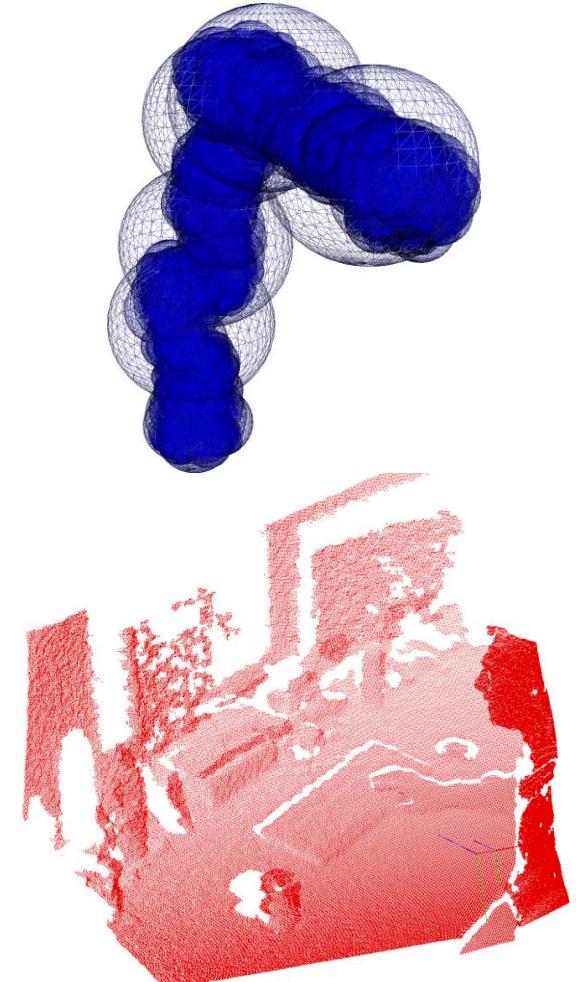
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*In Parallel* ISTs ∈ Robot:

*In Parallel* point p ∈ Point Cloud:

```
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```

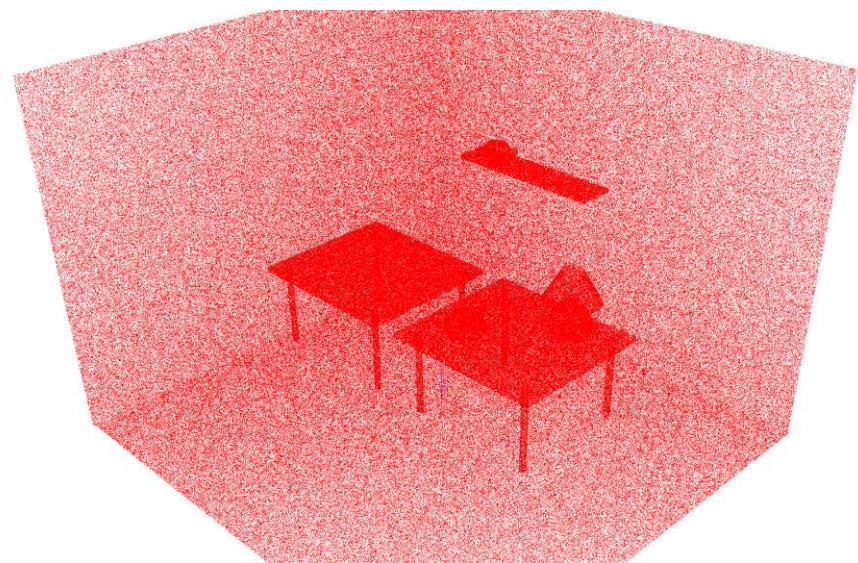
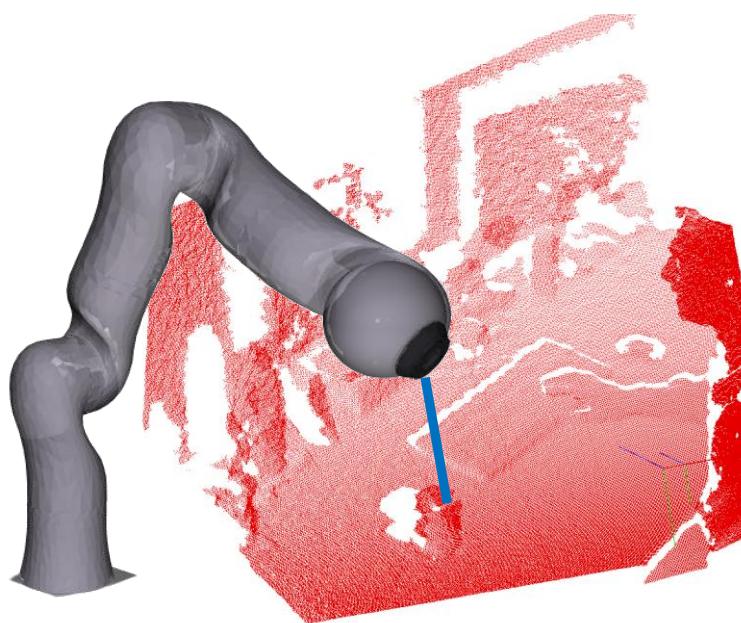
```
getDistance( Sphere s, Point p, d )
forall the Children sc of s do
    d = distance( sc, p )
    if d < minDist then
        getDistance( sc, p, d )
    if s is Leaf then
        minDist = atomicMin( d, minDist )
```



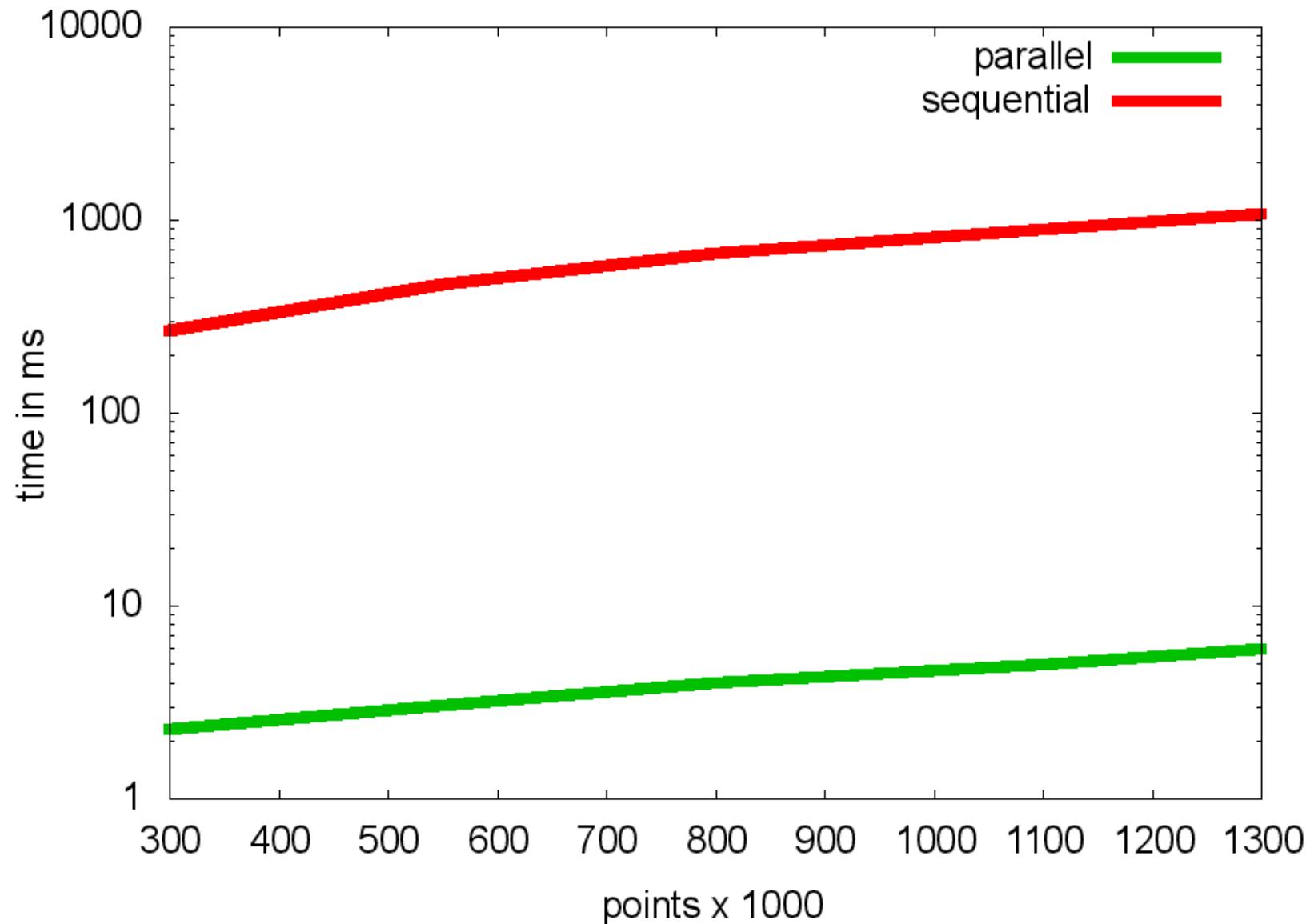


# Test Scenarios

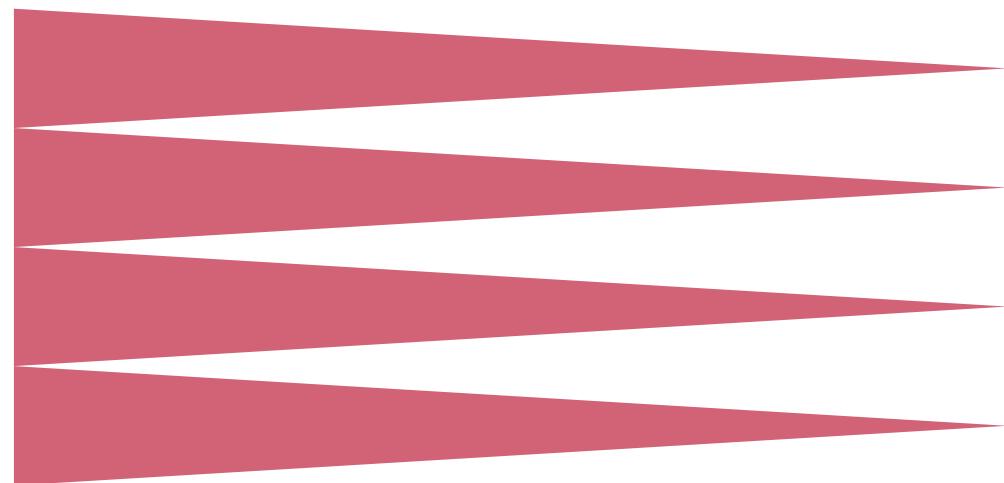
- Implemented in CUDA (5.5 & 6.0)
- Geforce GTX 780, 2GByte Memory
- Pre-recorded and artificial point clouds with up tp 5M points



# Results: Parallel vs. Sequential

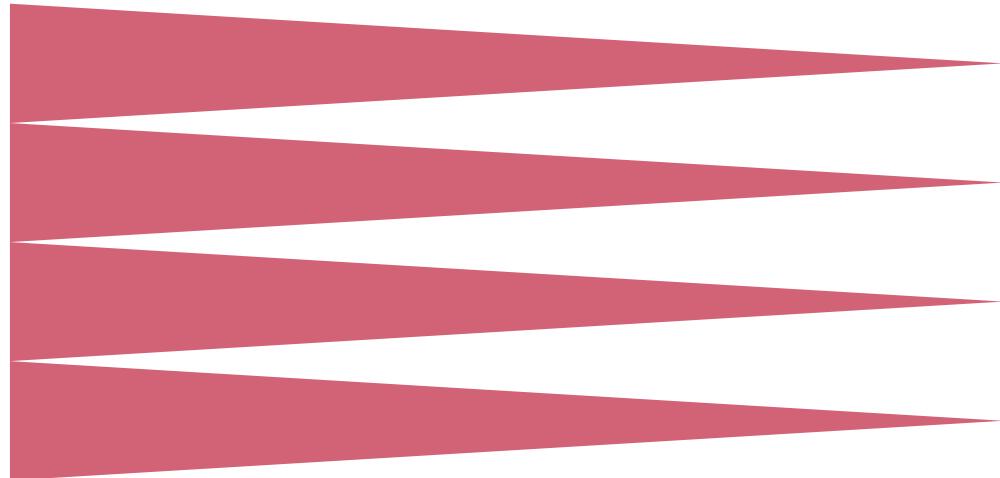


# Collision Detection beyond BVHs



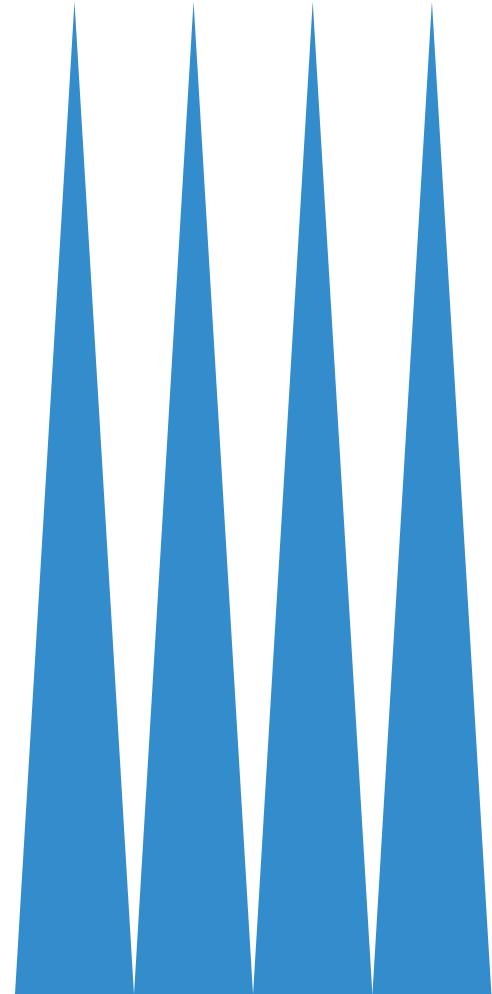
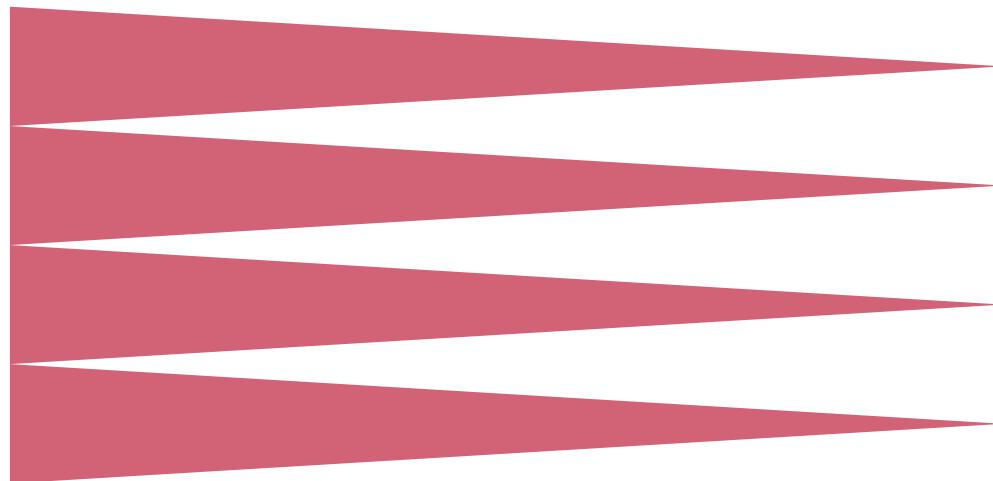
# Collision Detection beyond BVHs

- BVHs are just a heuristic



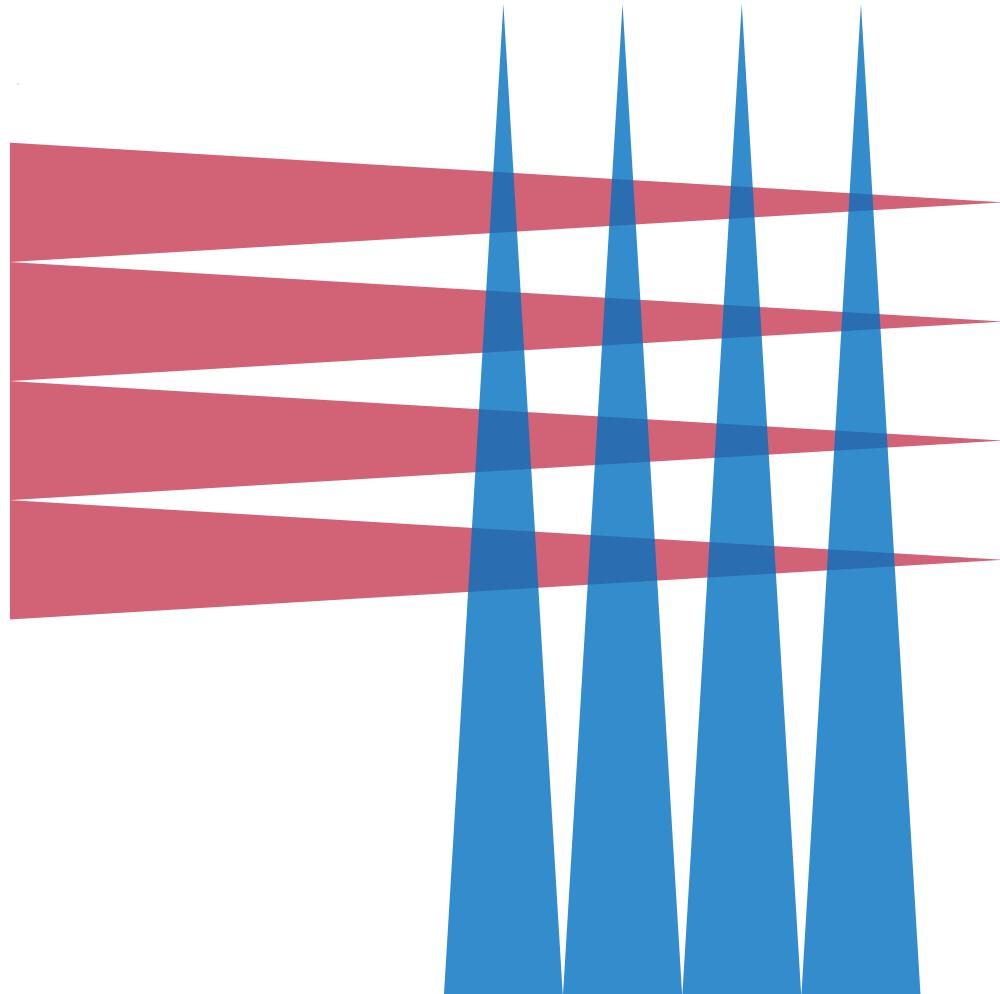
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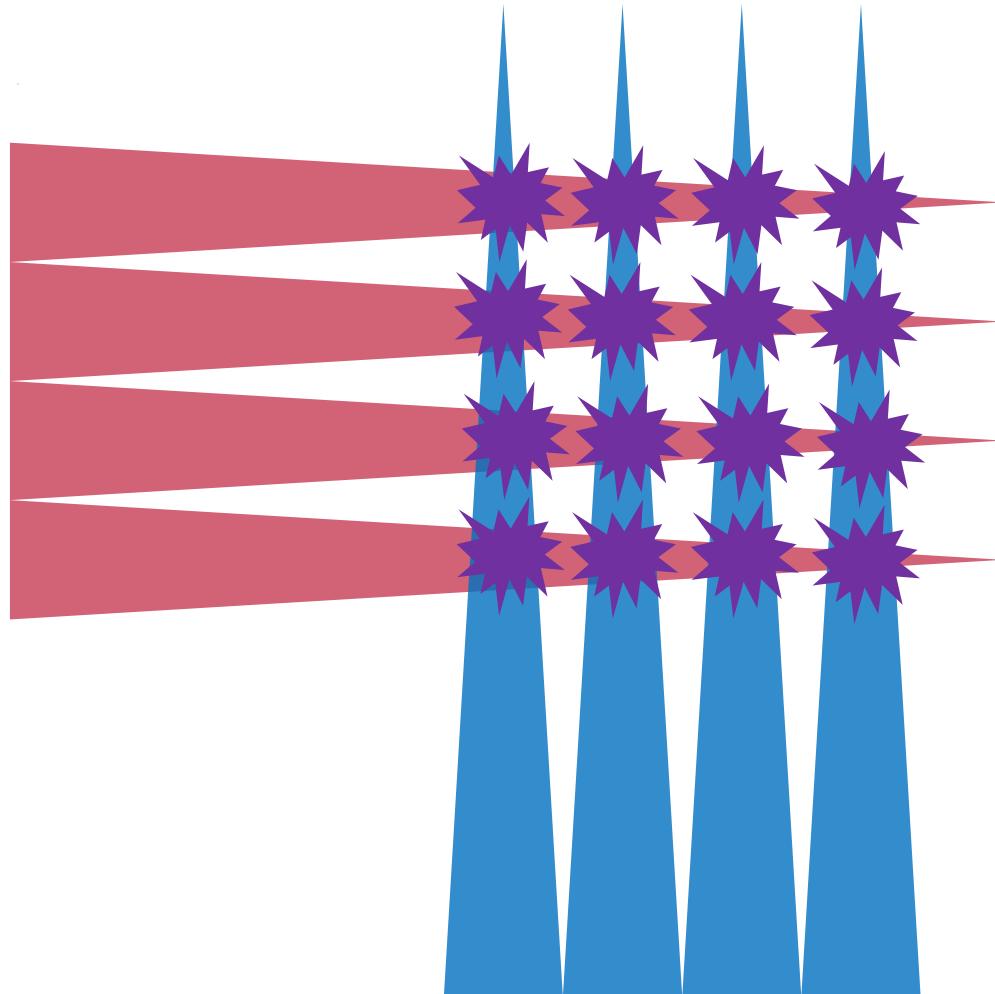
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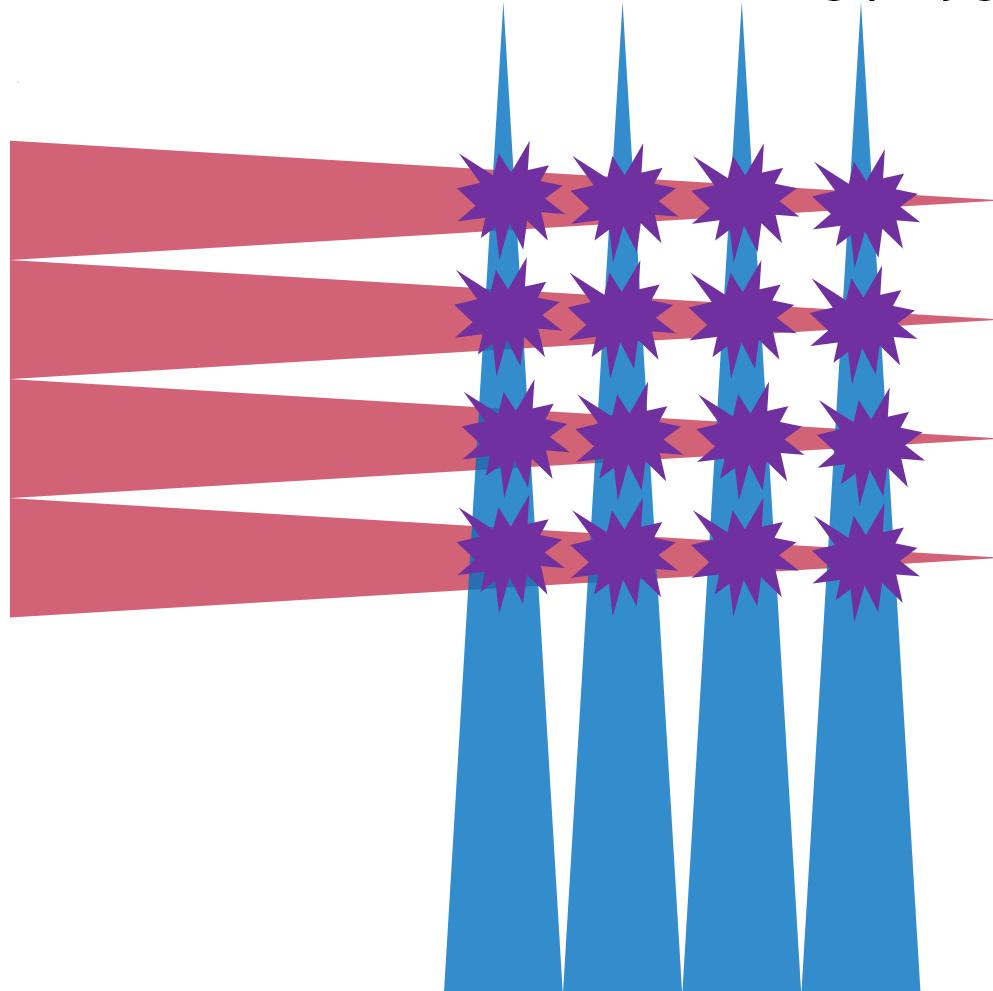
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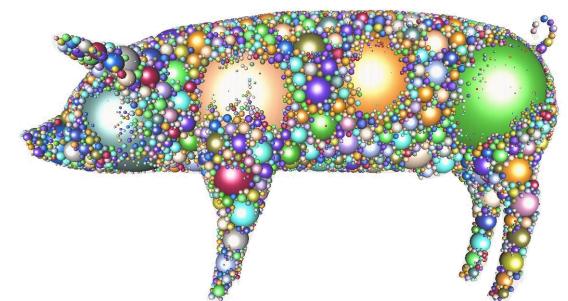
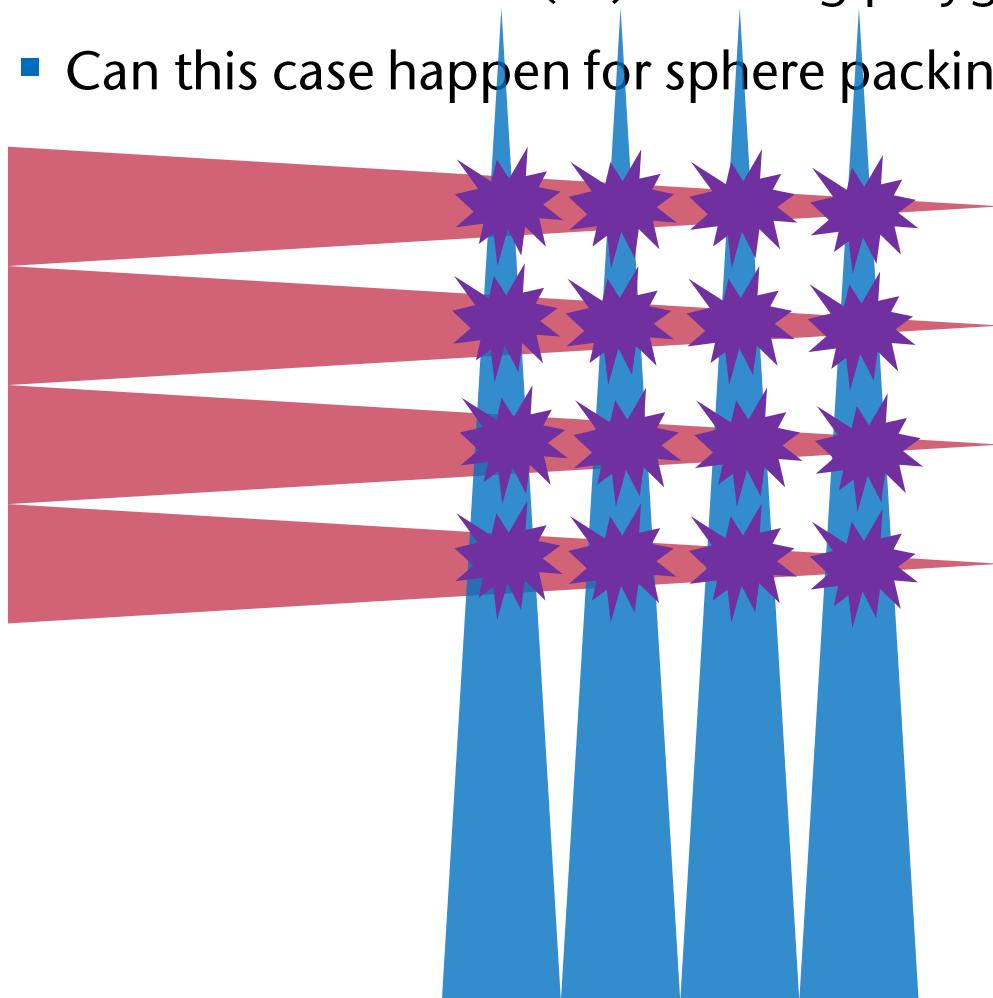
# Collision Detection beyond BVHs

- BVHs are just a heuristic
- In the worst case:  $O(n^2)$  colliding polygons

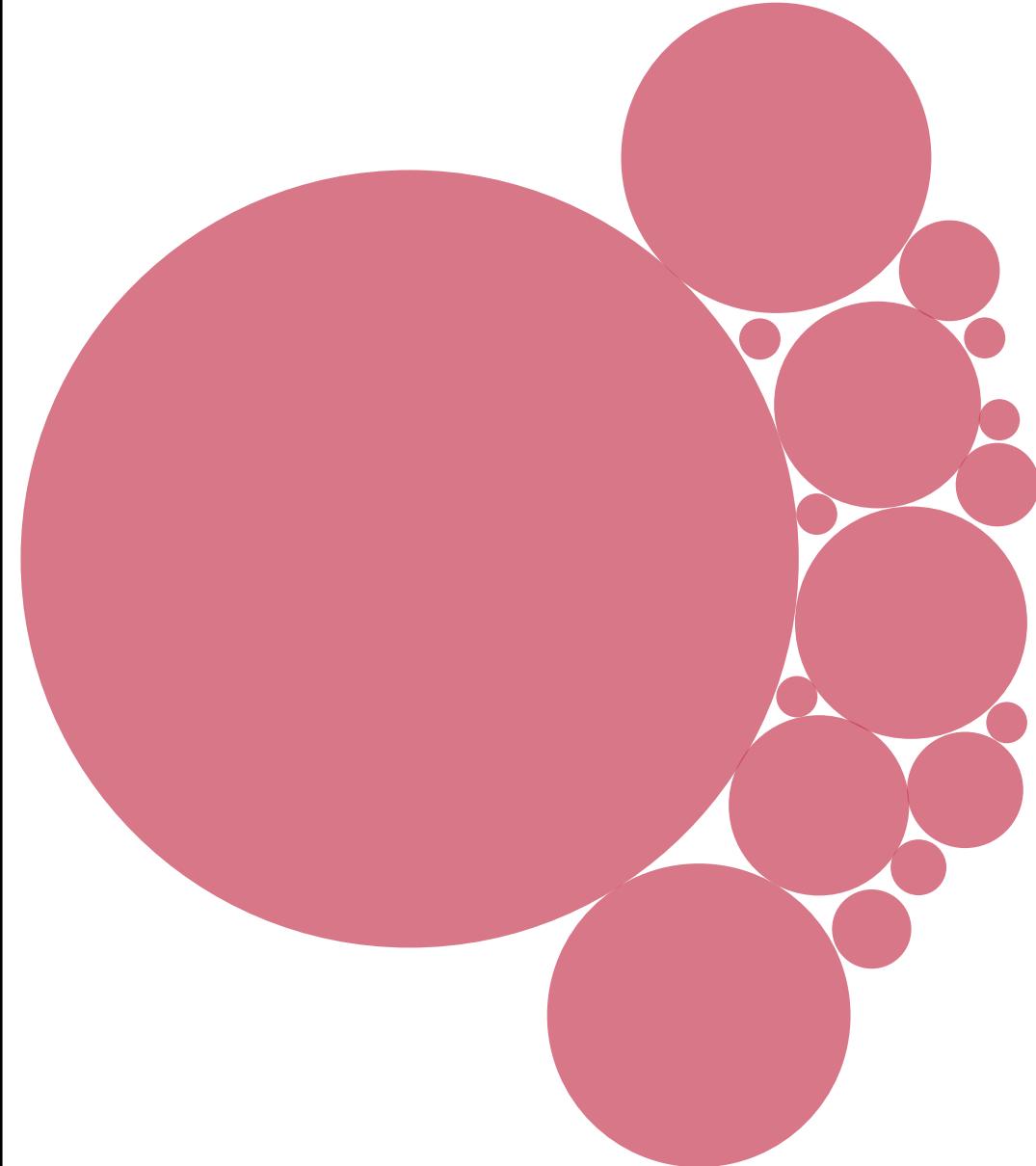


# Collision Detection beyond BVHs

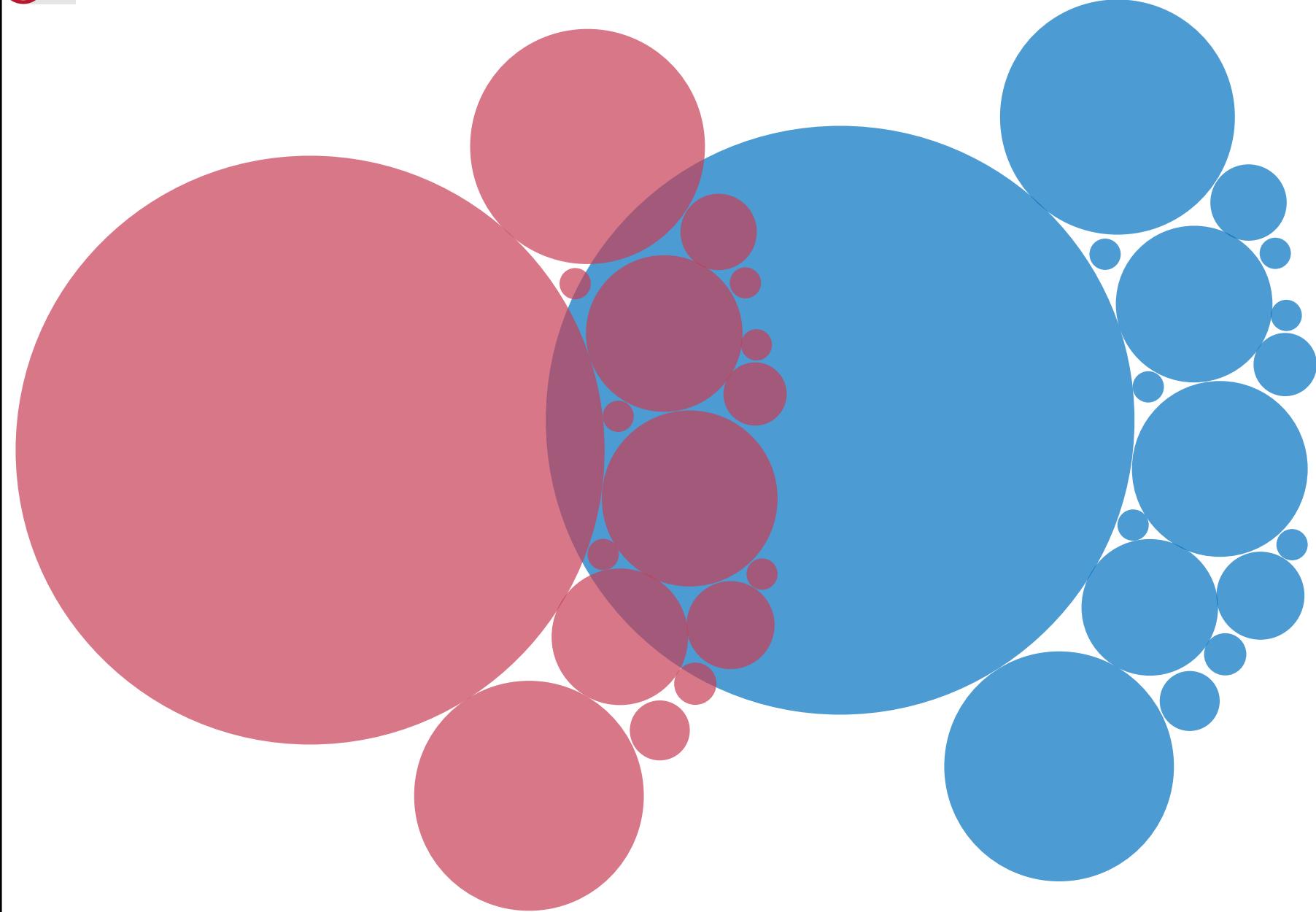
- BVHs are just a heuristic
- In the worst case:  $O(n^2)$  colliding polygons
- Can this case happen for sphere packings?



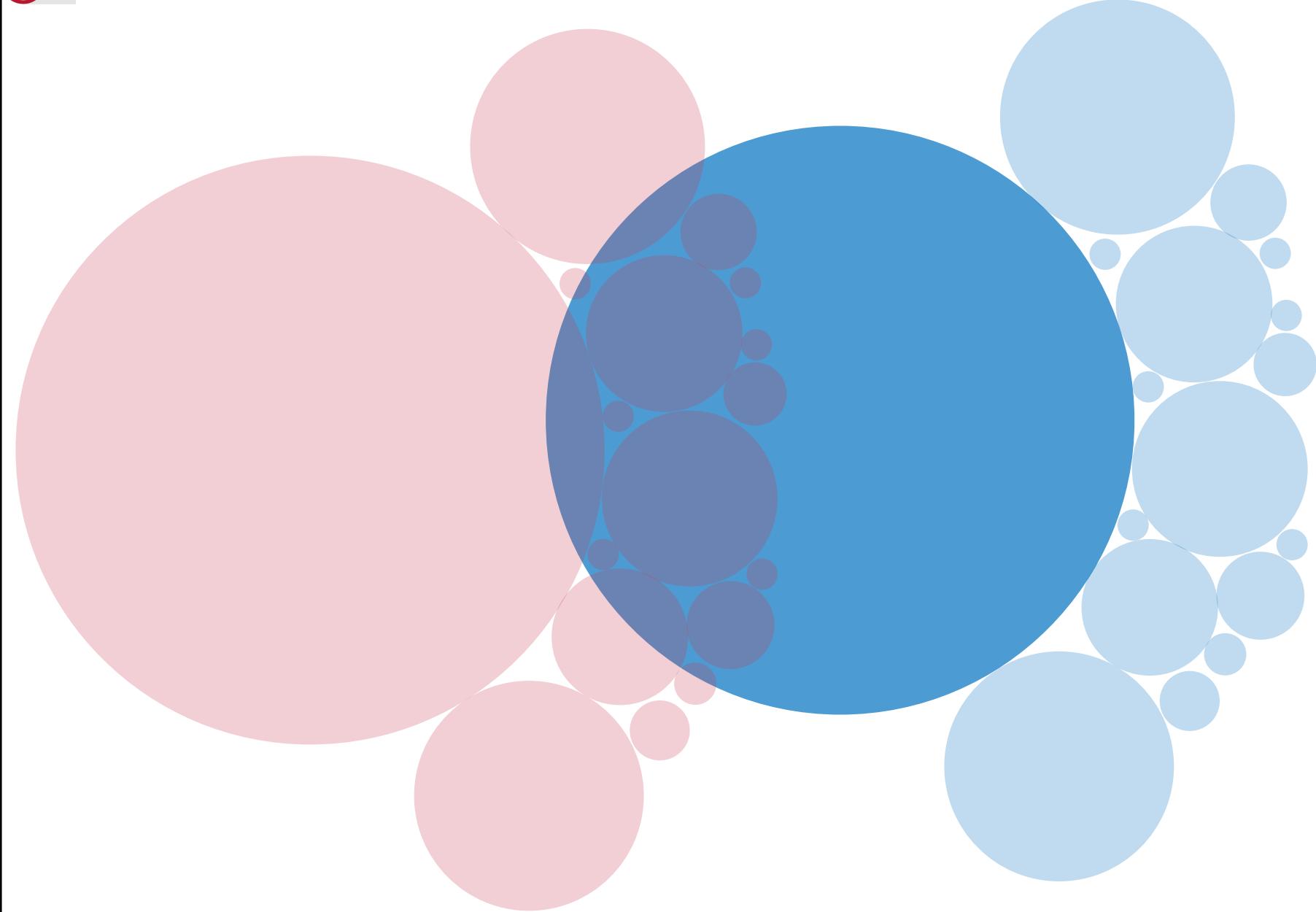
# Theoretical Foundation



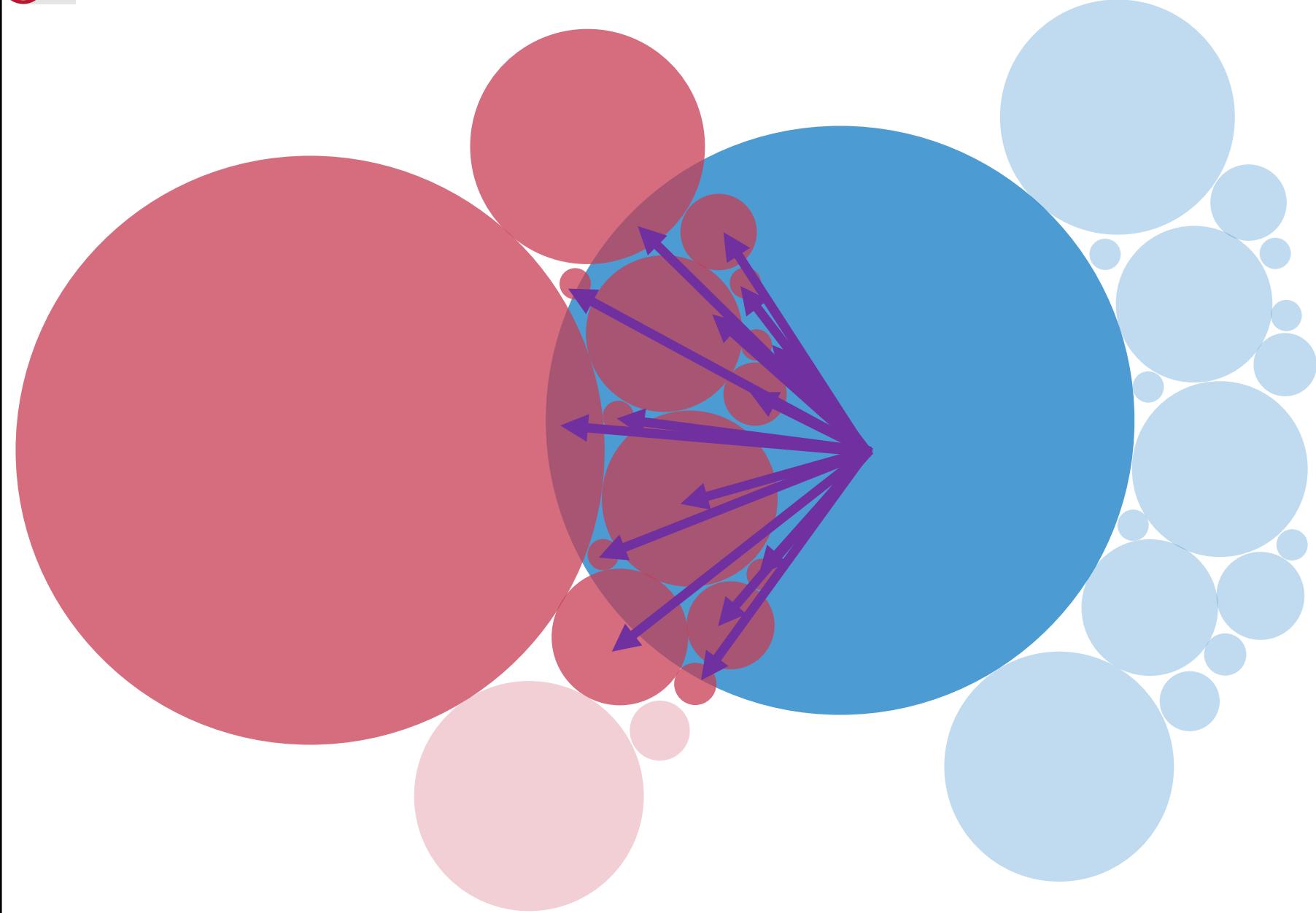
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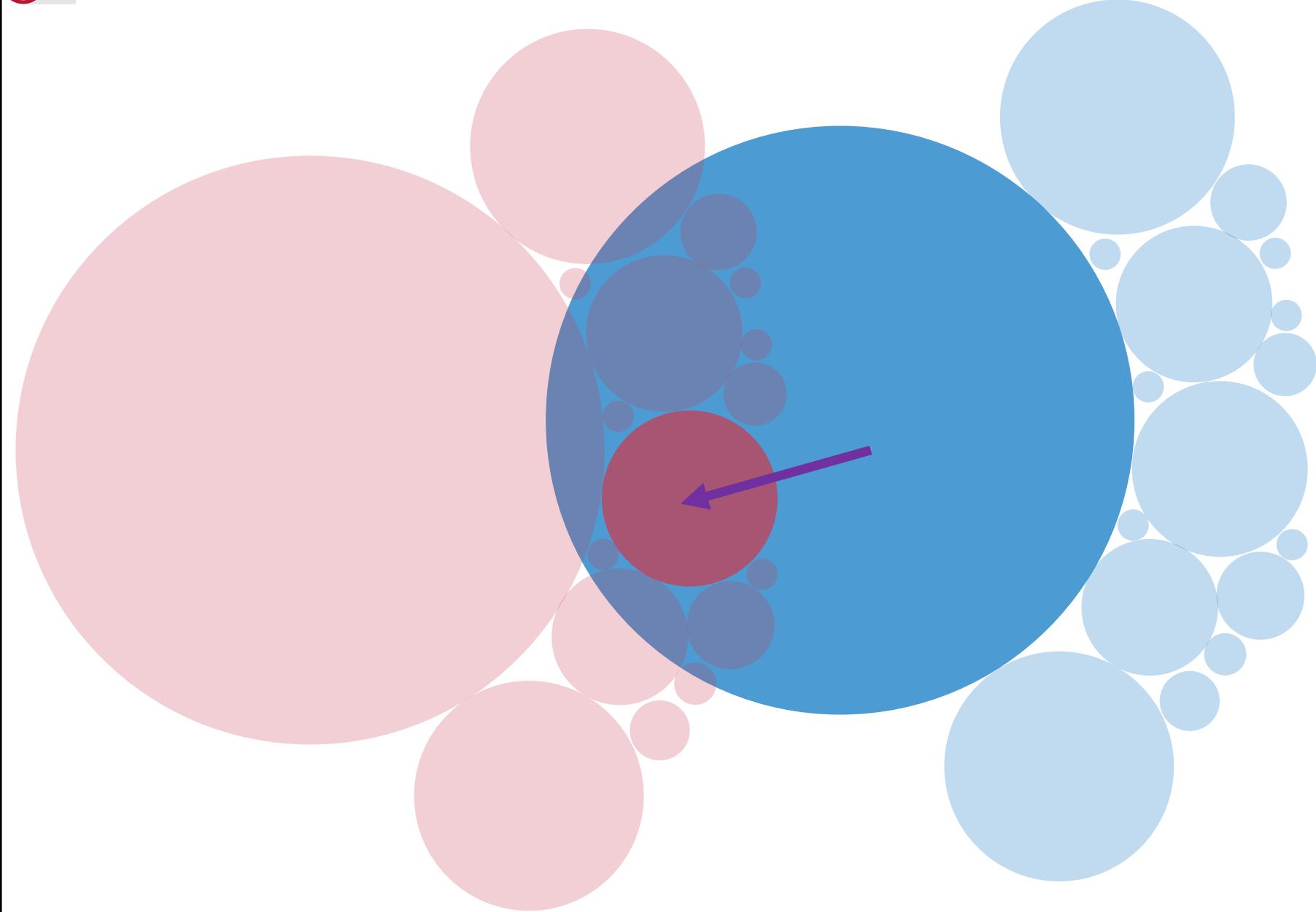
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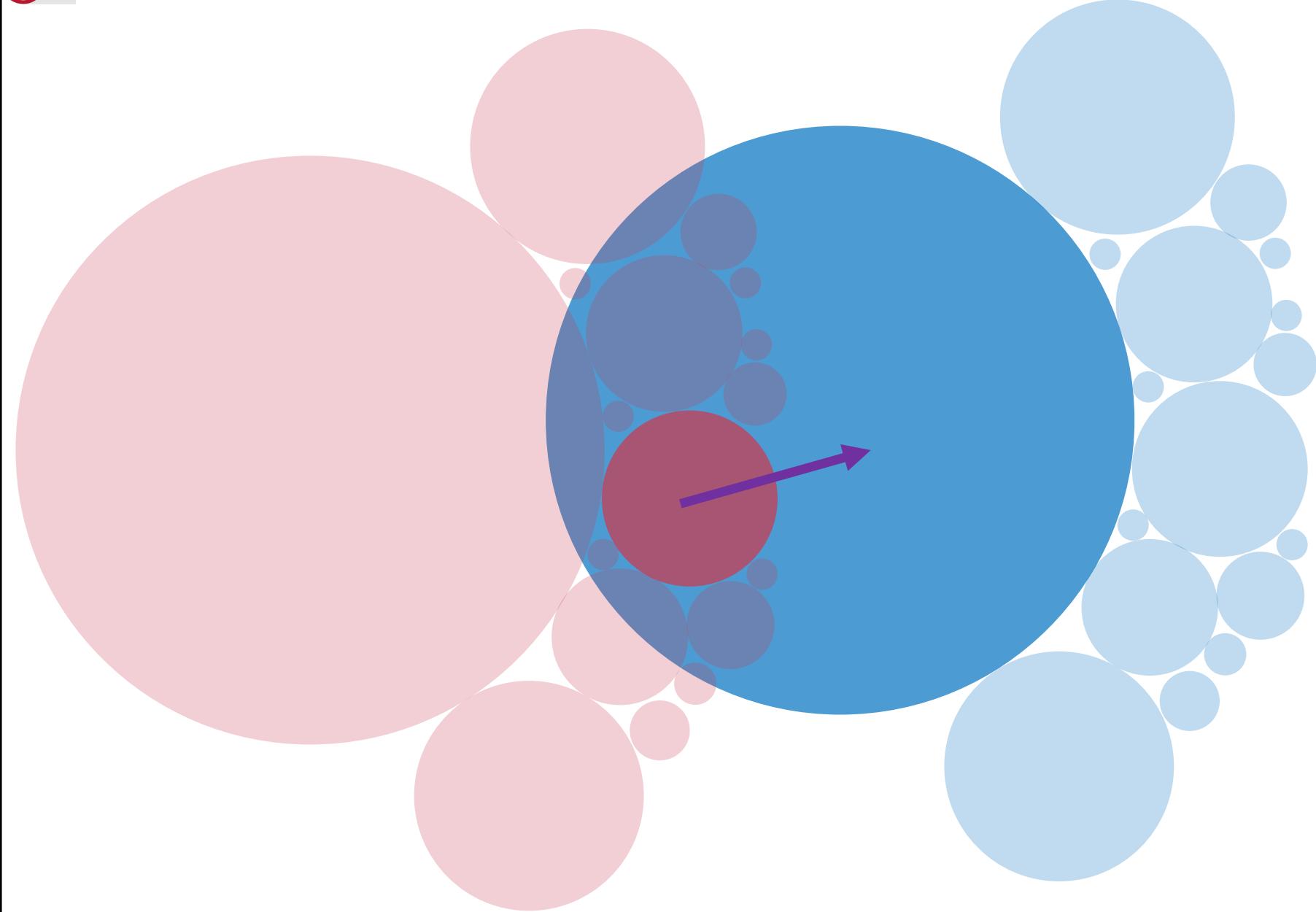
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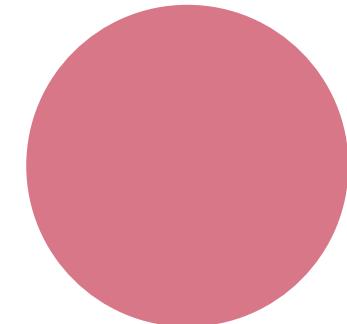
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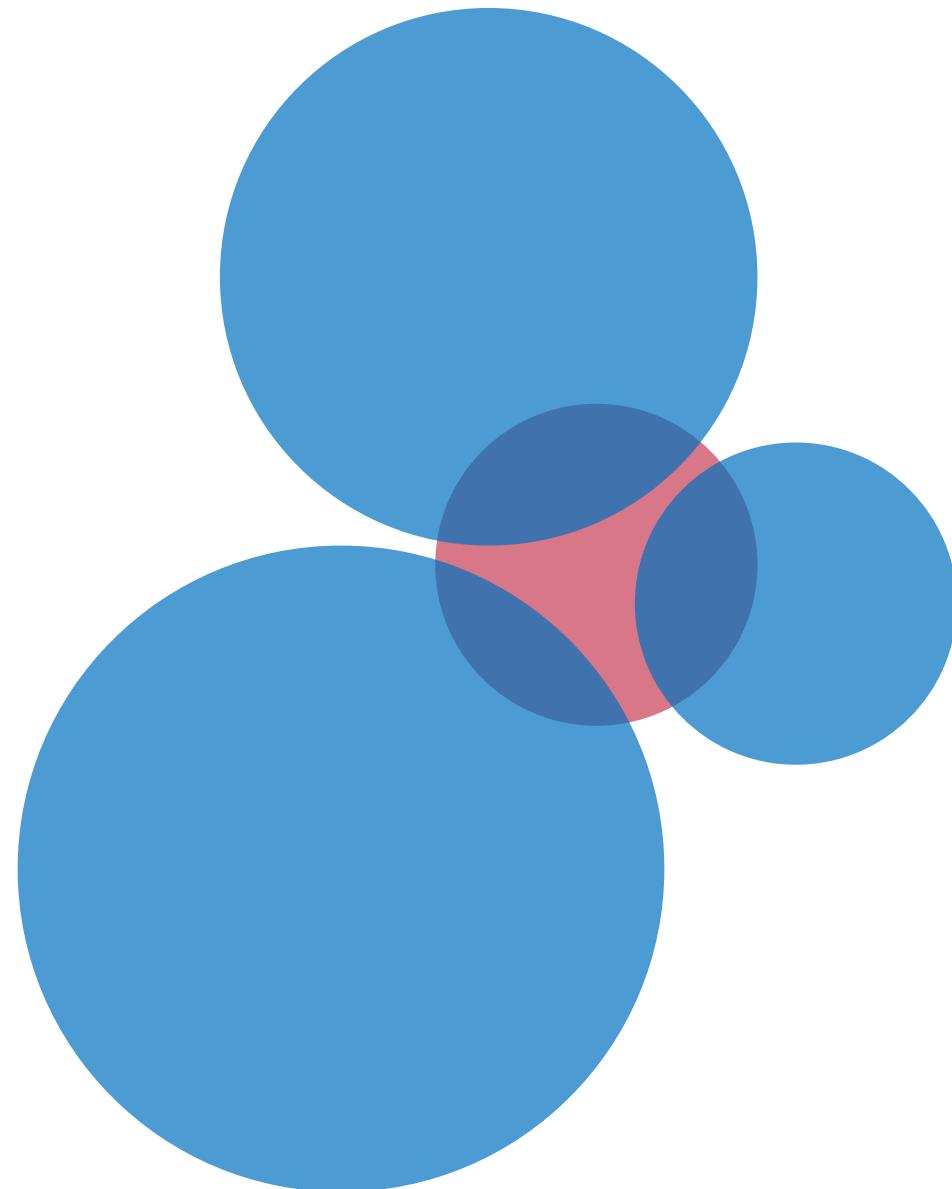
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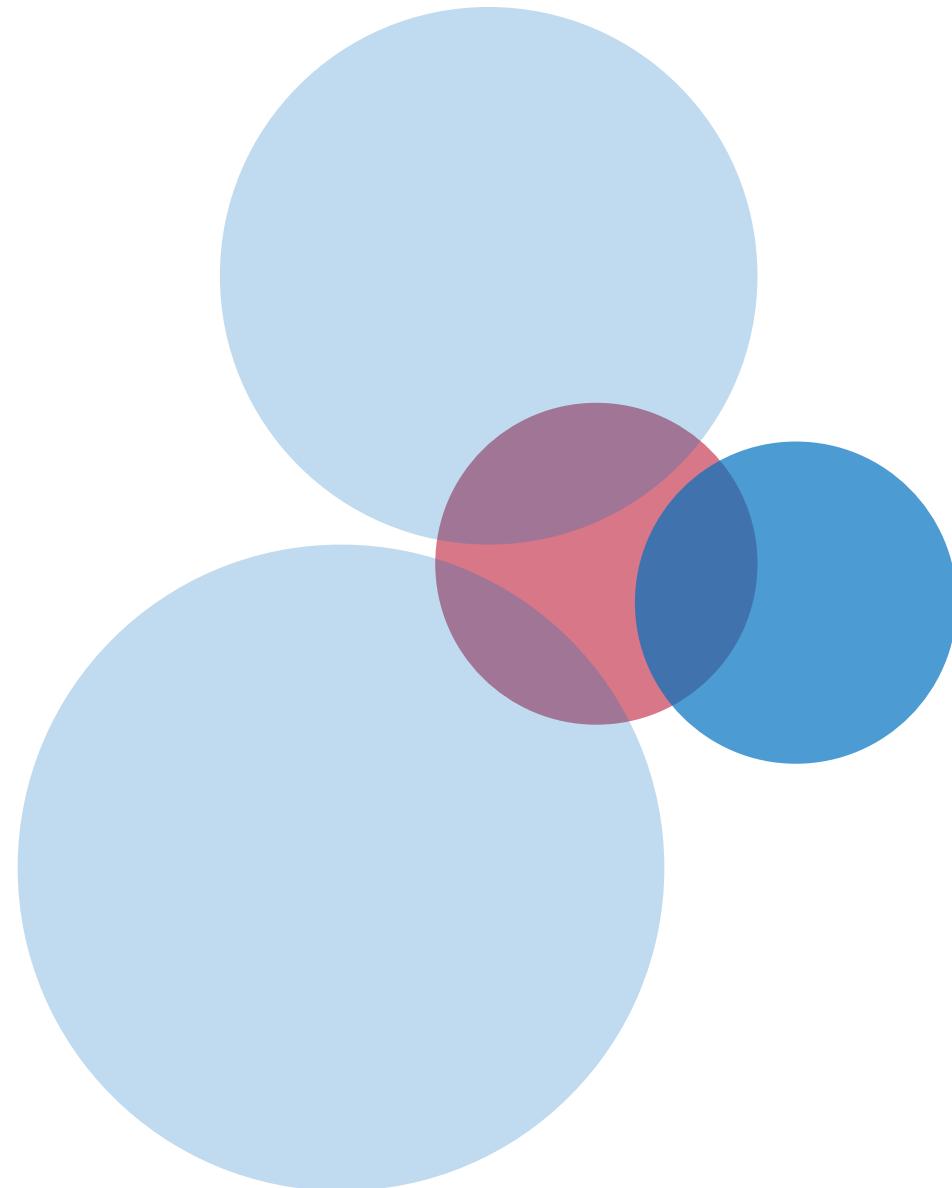
# Theoretic Fundament



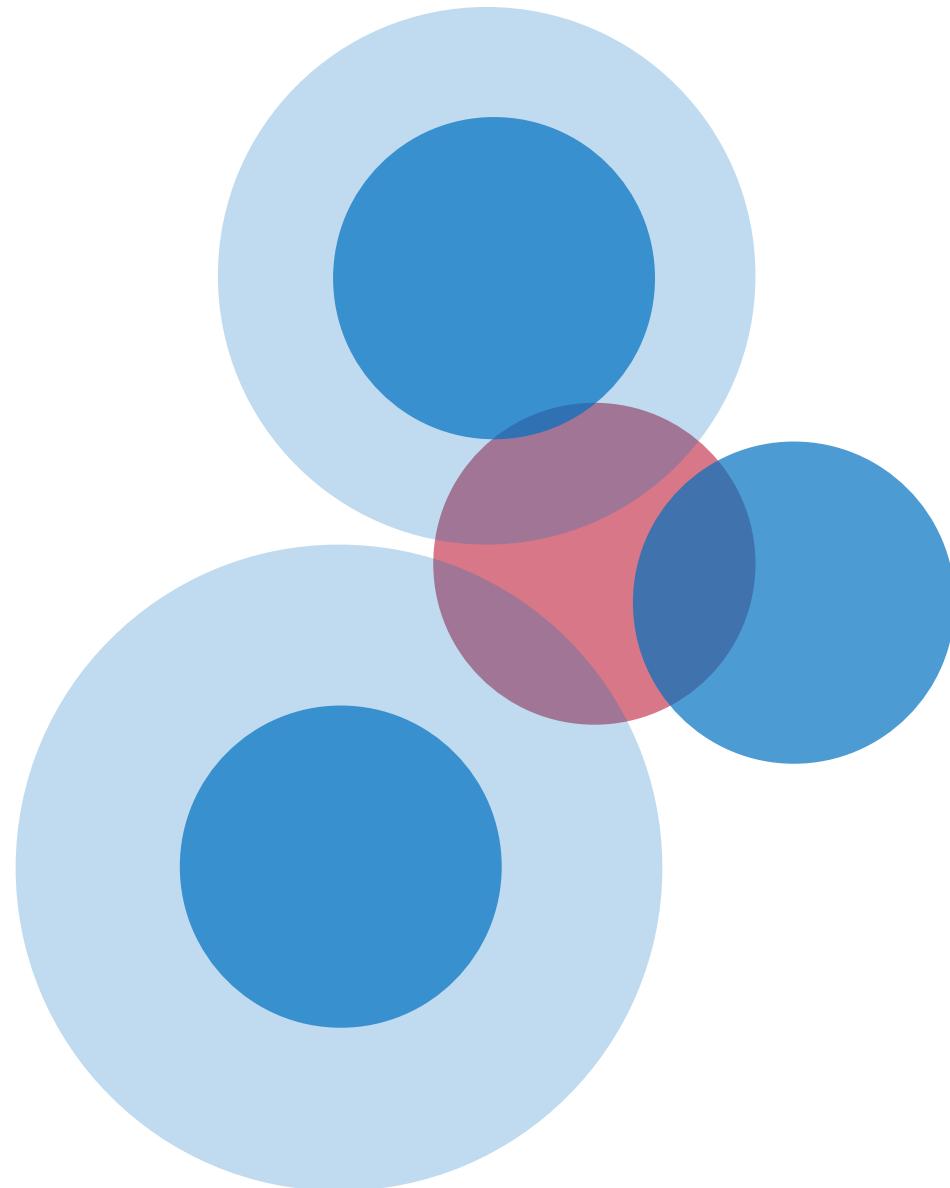
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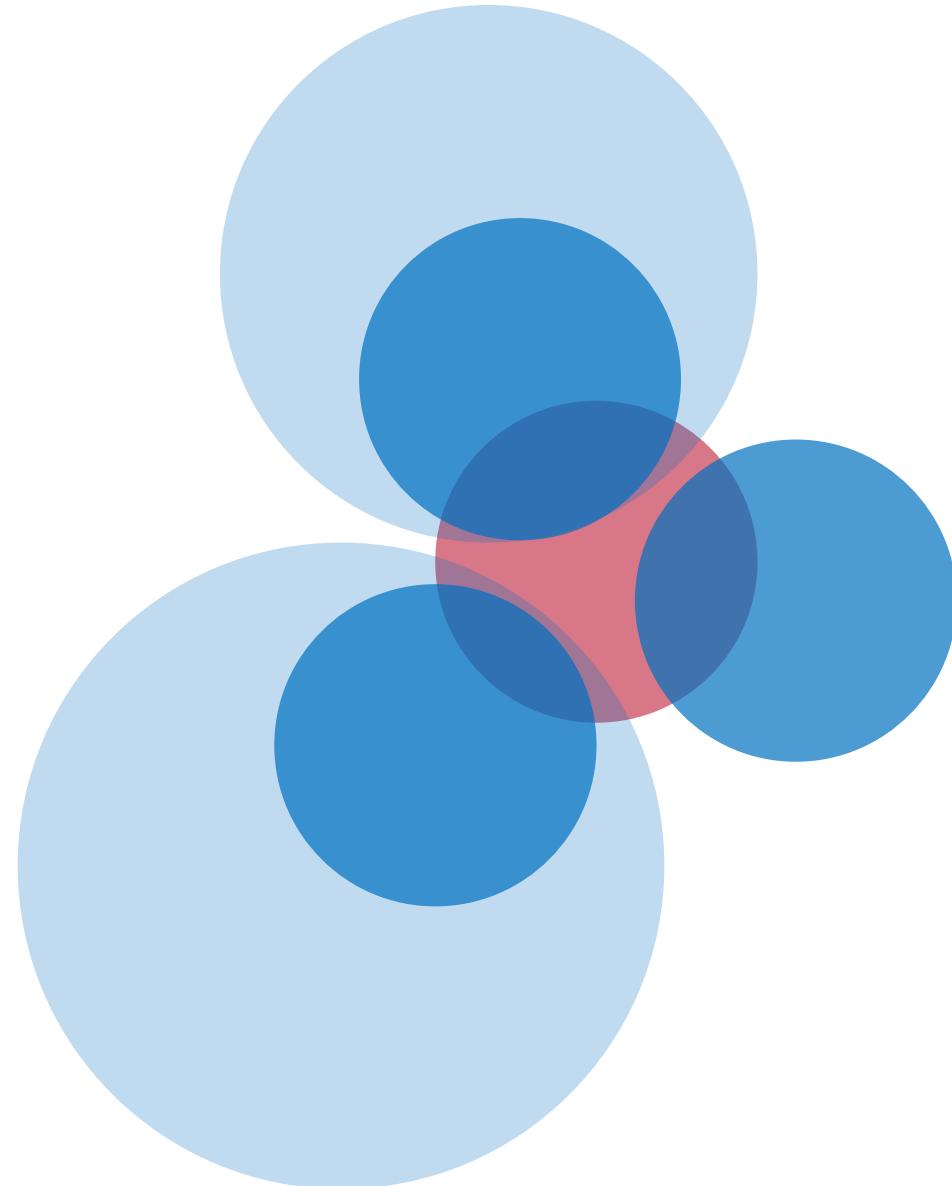
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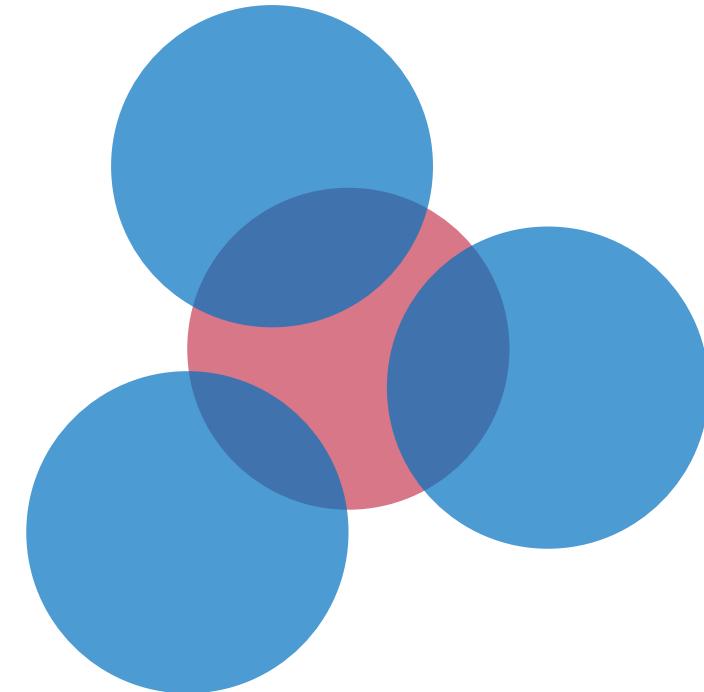
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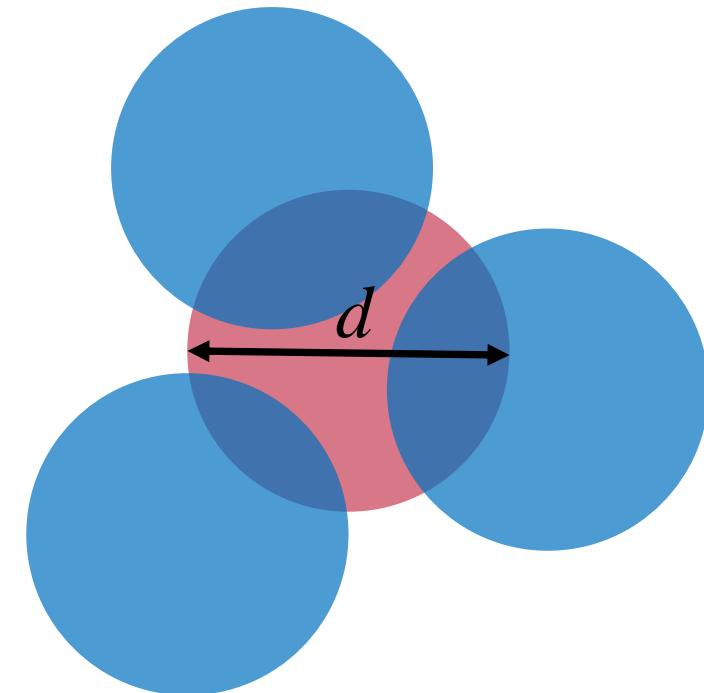
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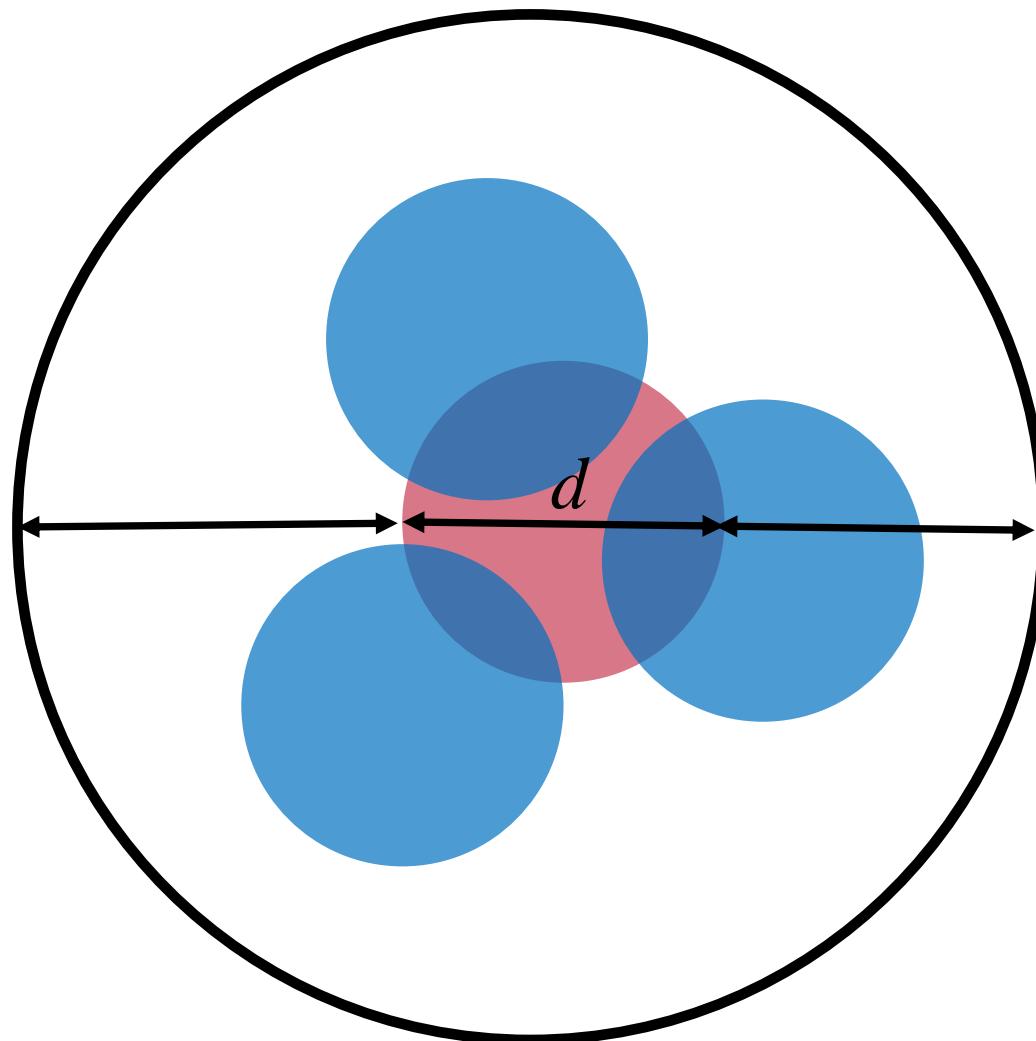
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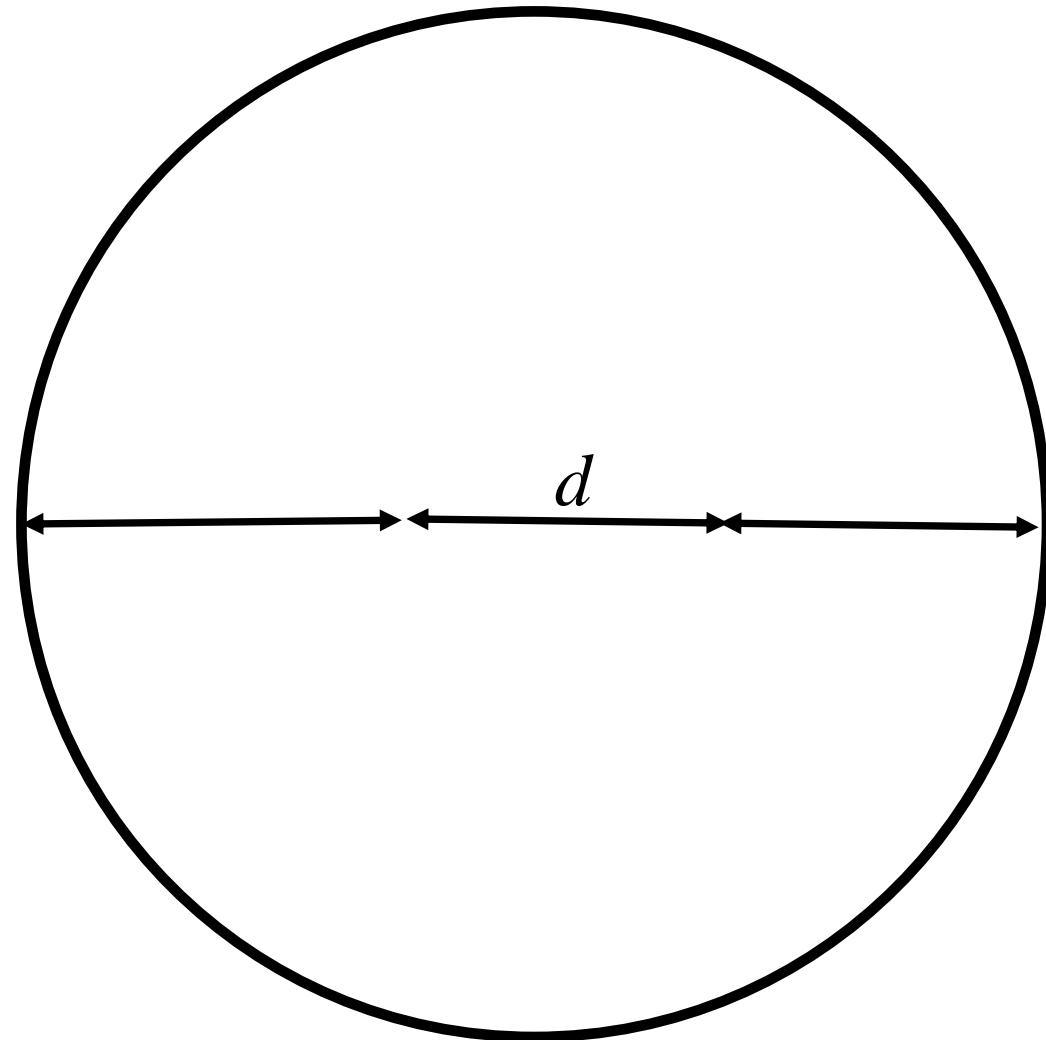
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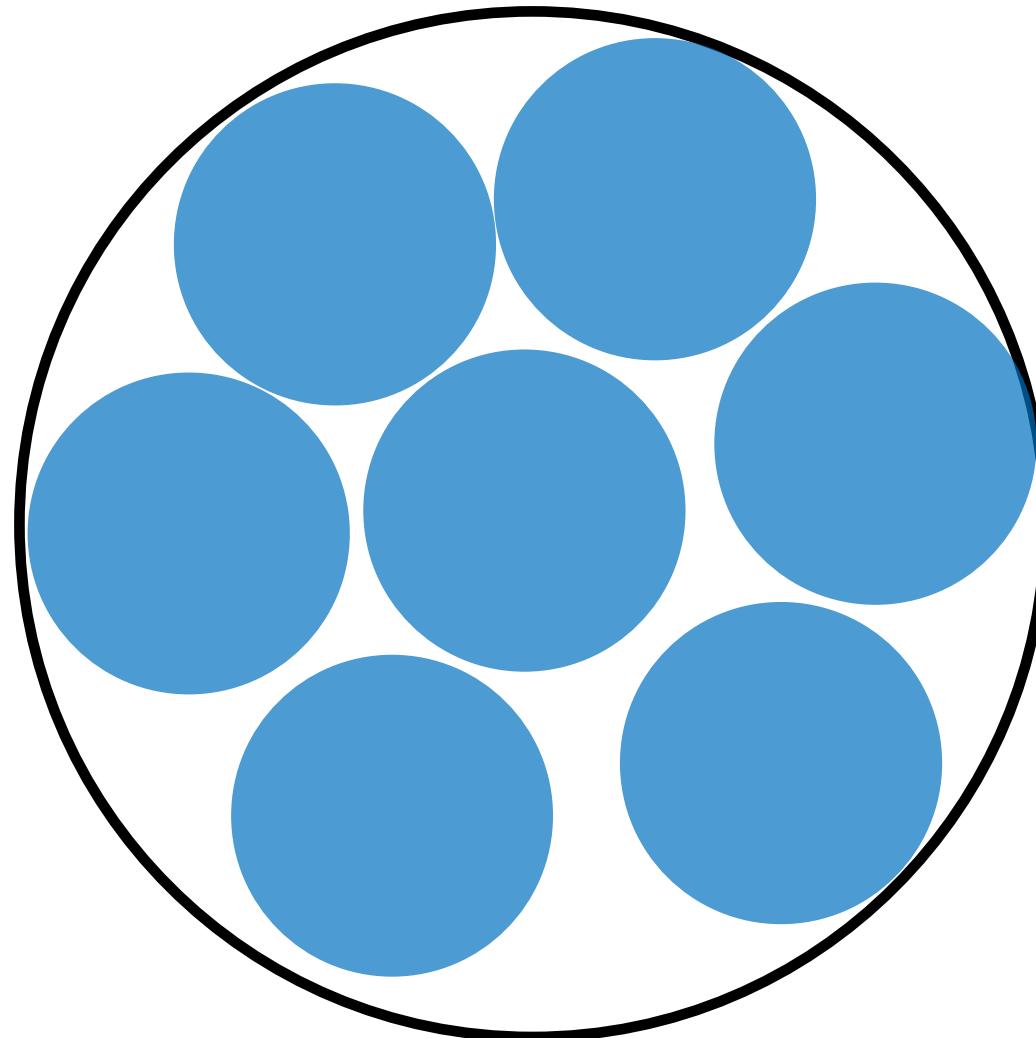
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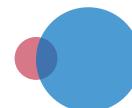
- Lemma: A single sphere  $s$  intersects a **constant** number of disjoint spheres  $A$  with at least the same radius.

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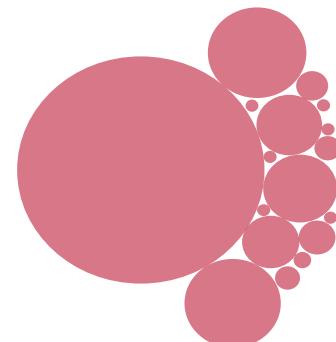
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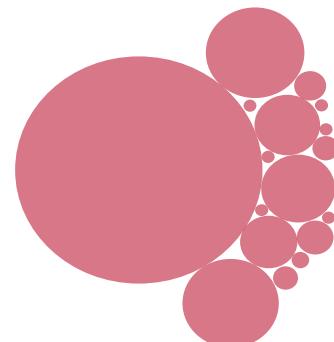
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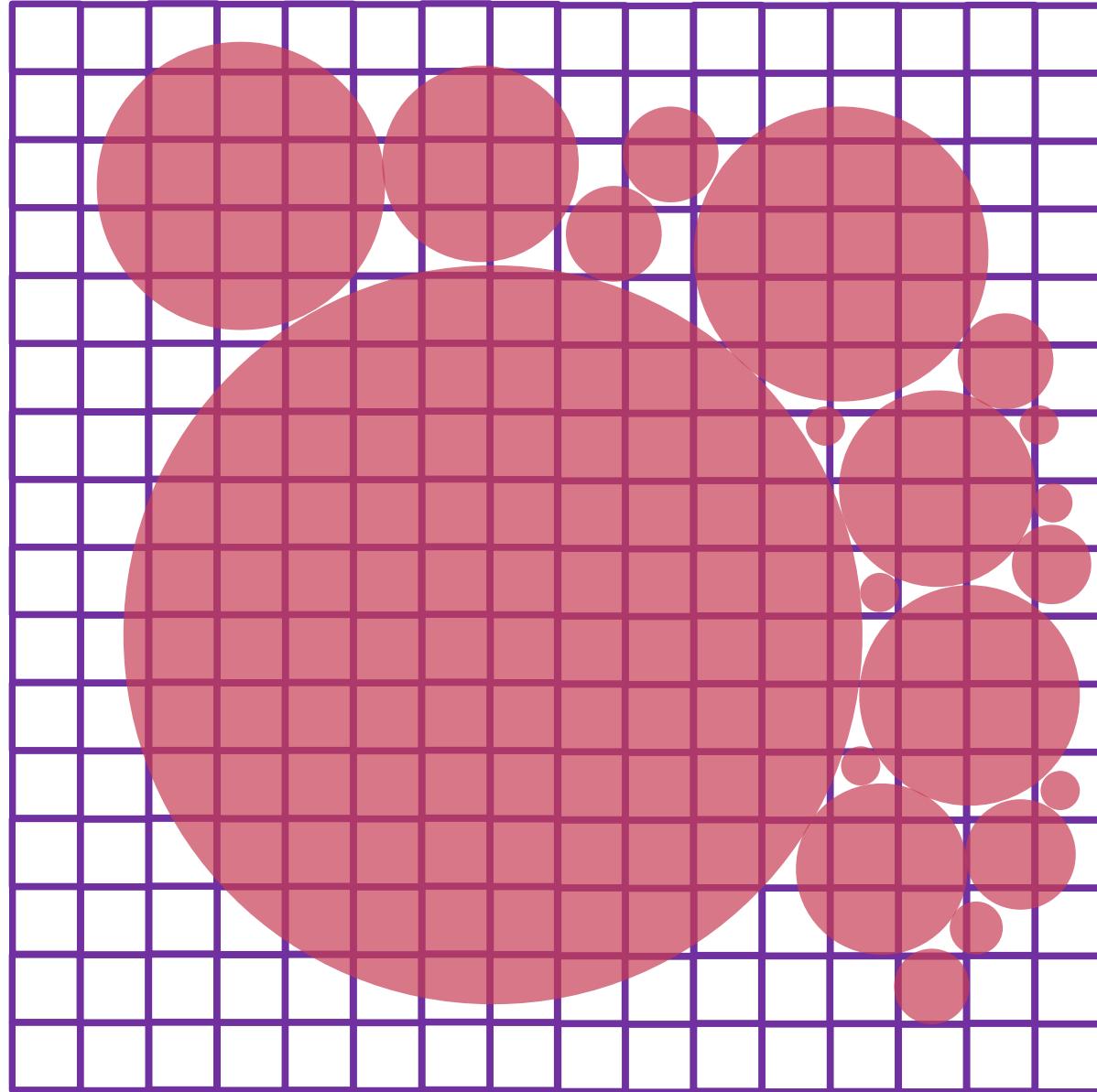
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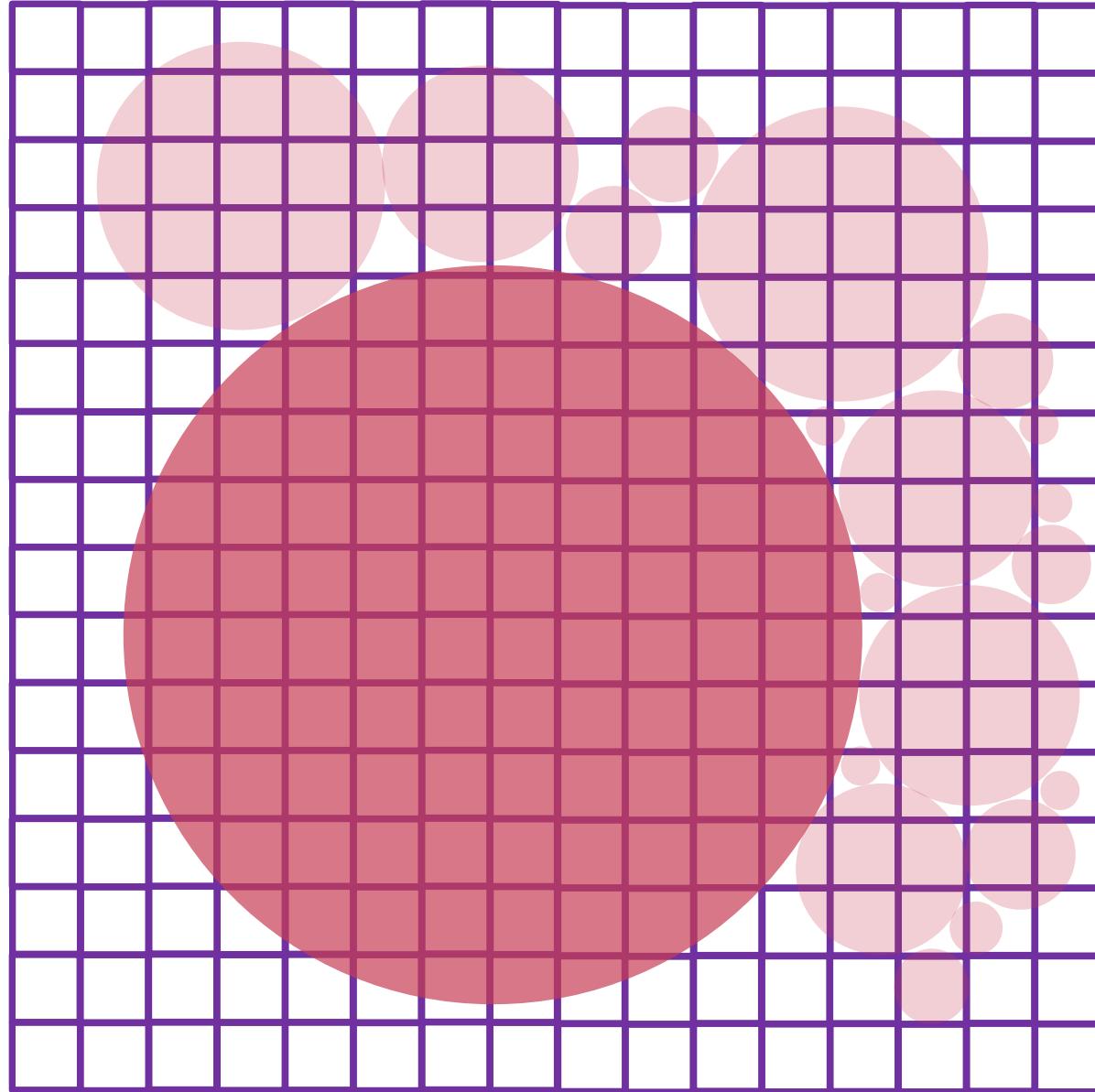
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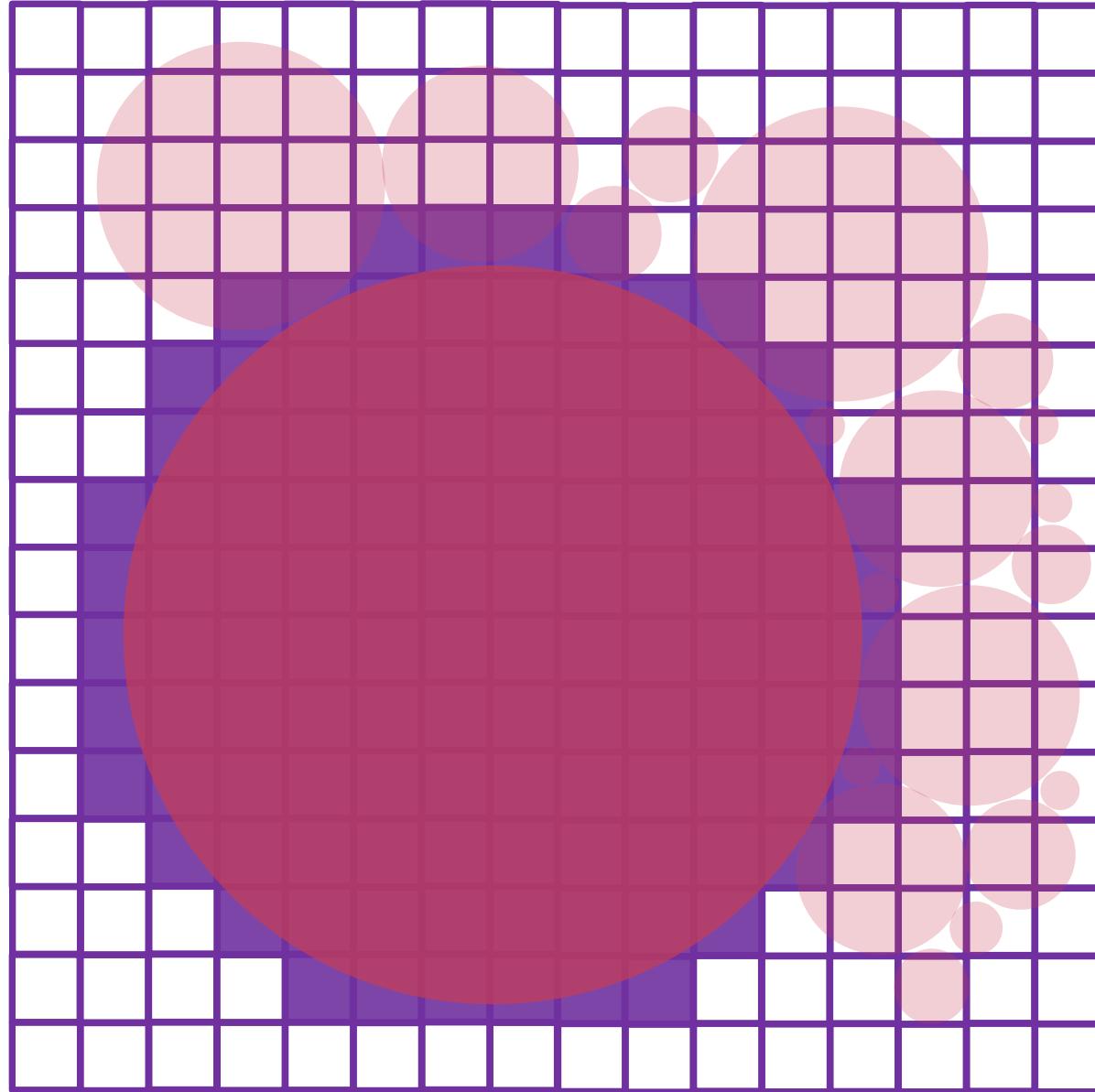
# Our Algorithm



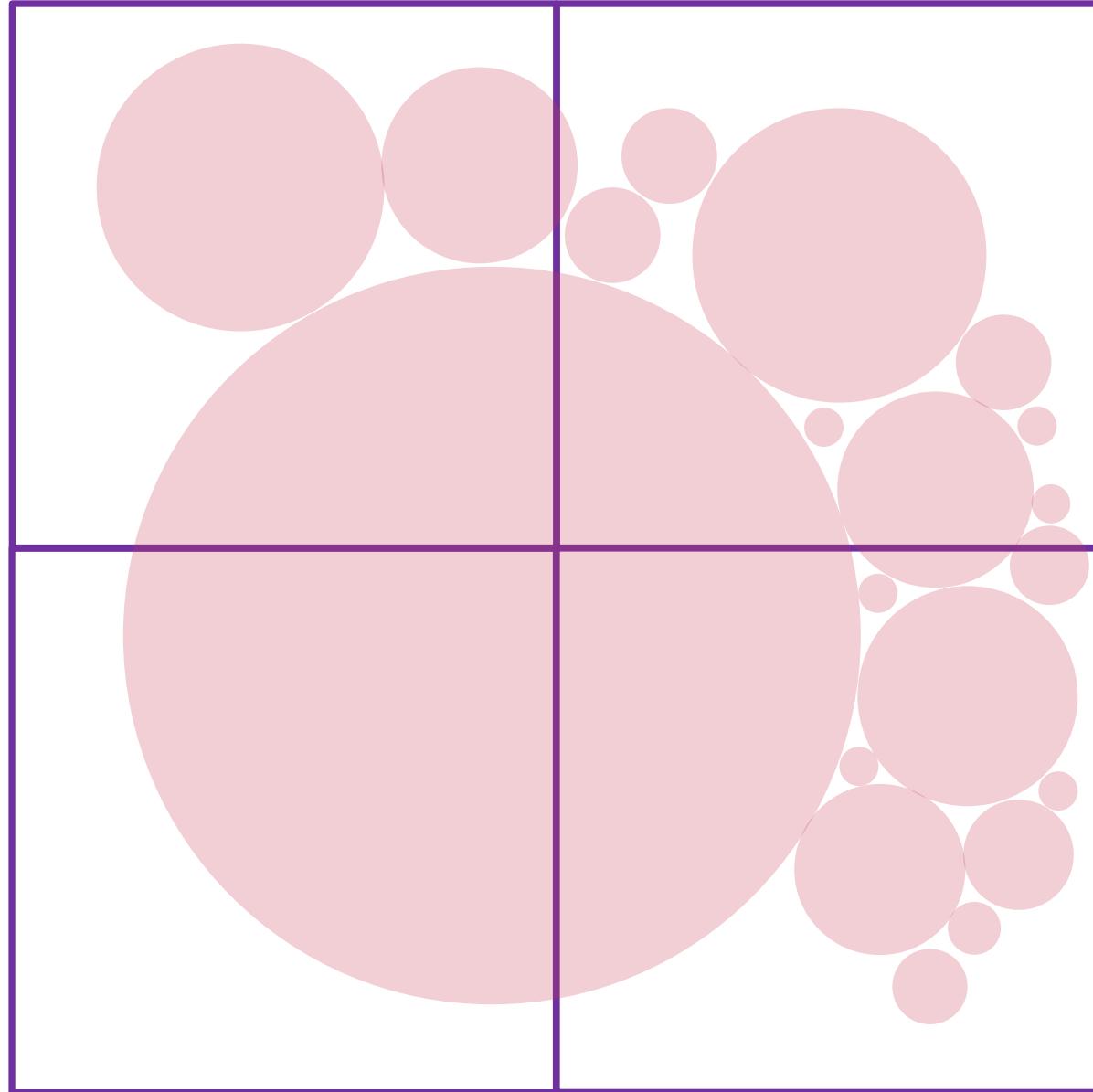
# Our Algorithm



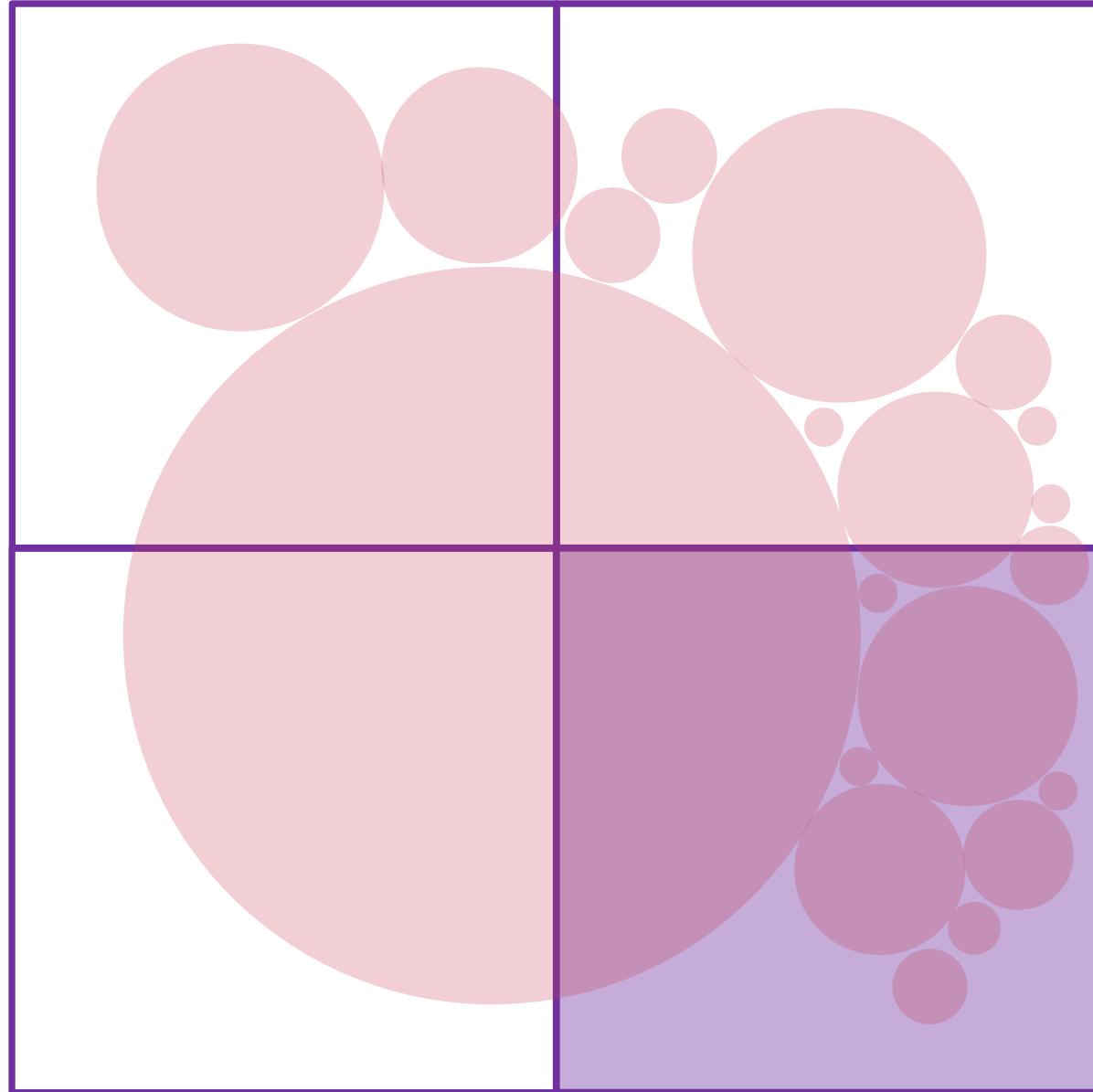
# Our Algorithm



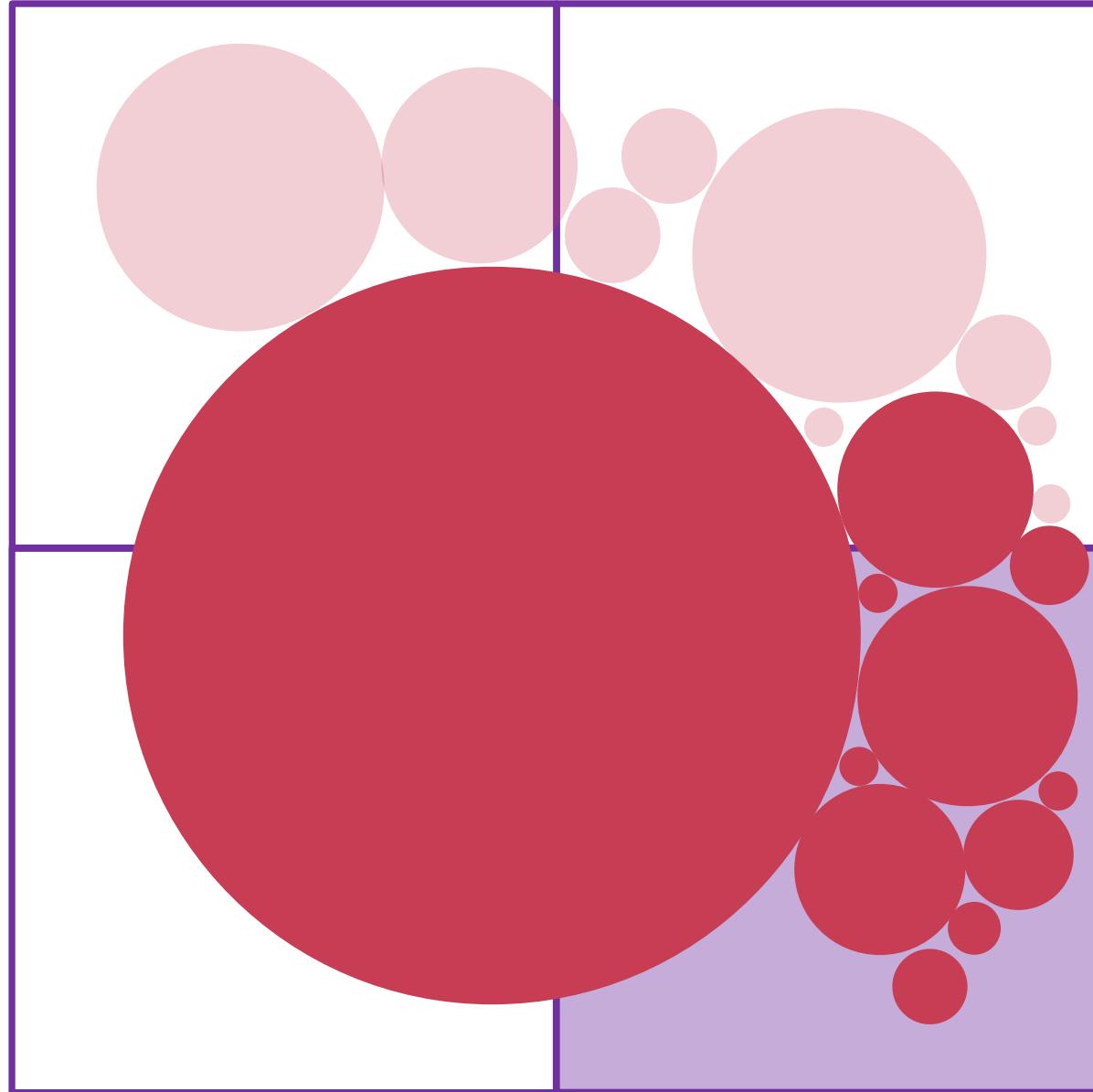
# Our Algorithm



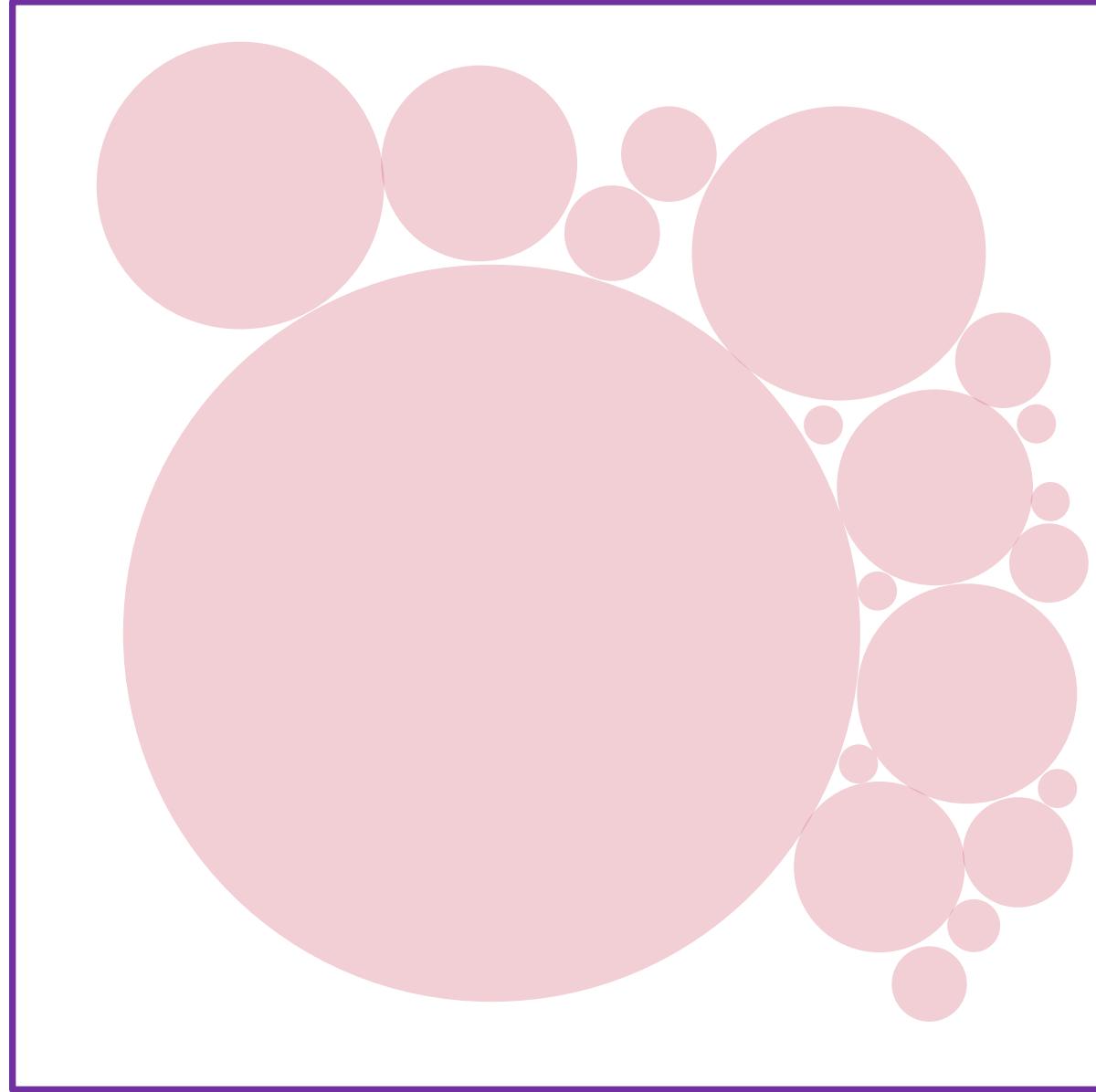
# Our Algorithm



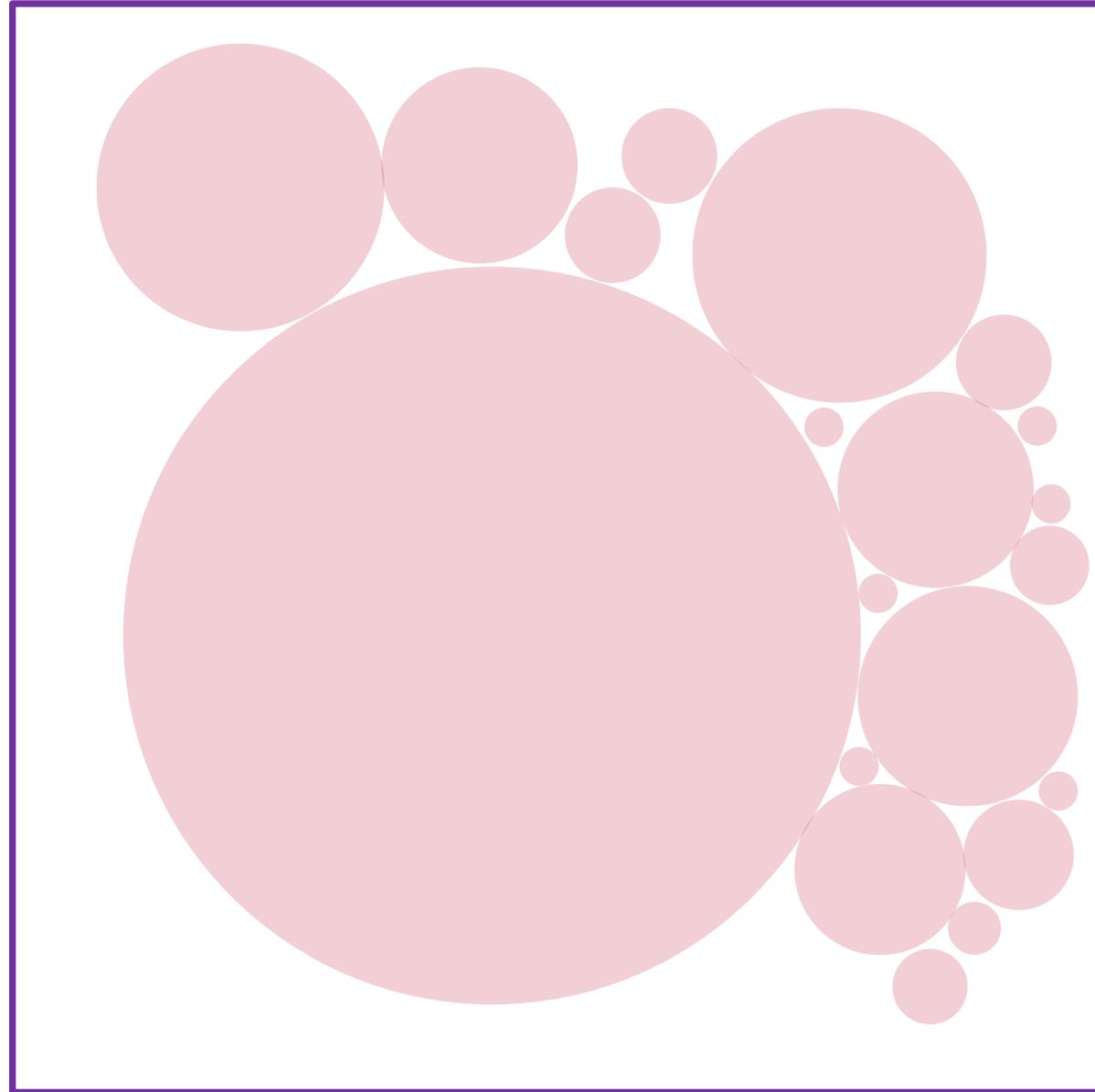
# Our Algorithm



# Our Algorithm



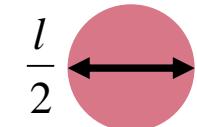
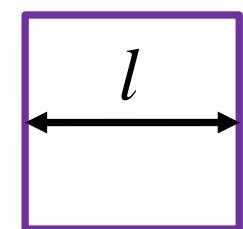
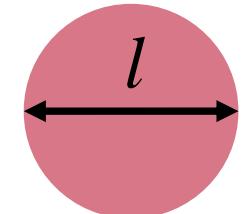
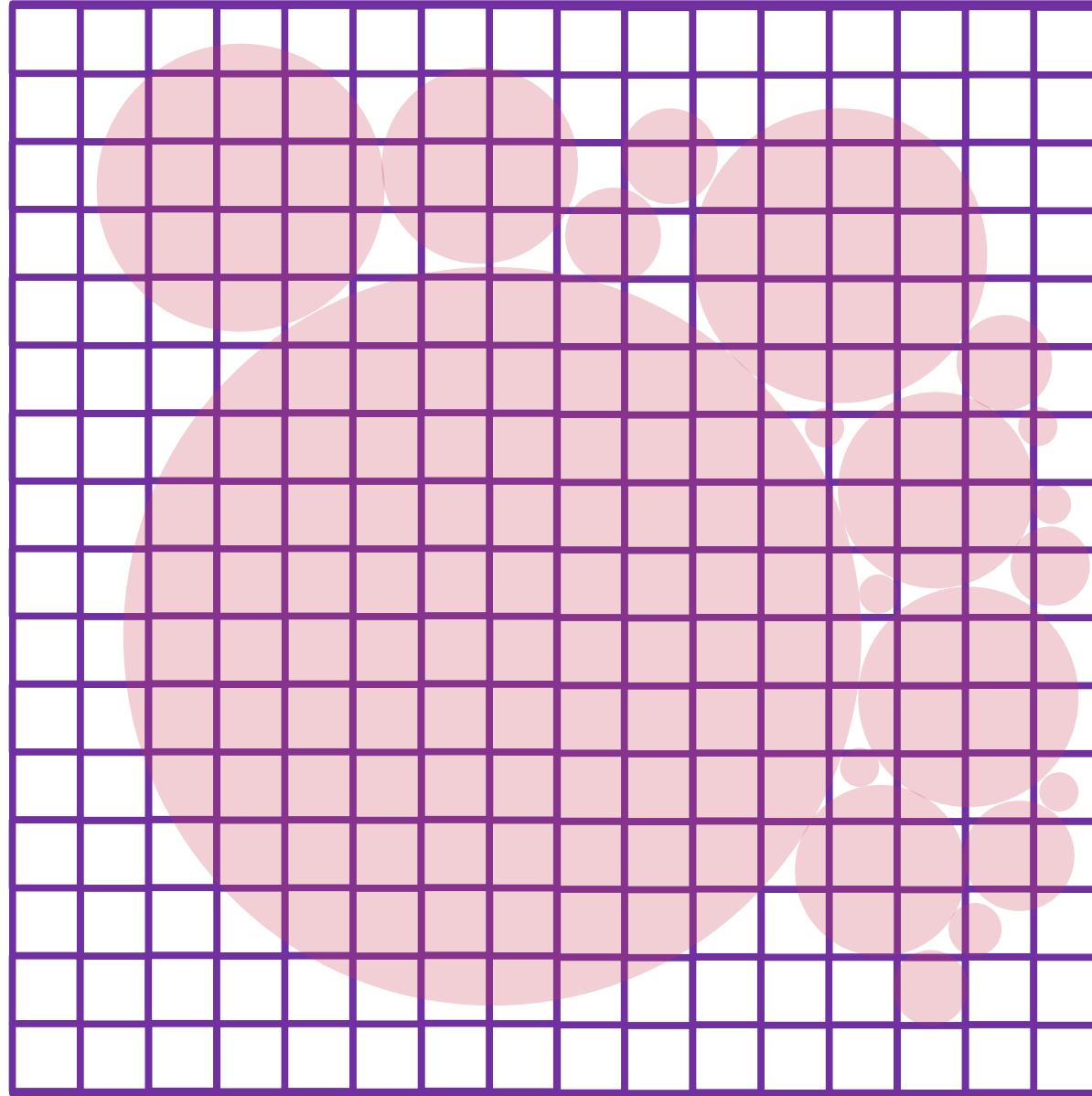
# Our Algorithm



# Our Algorithm

L  
e  
v  
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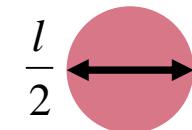
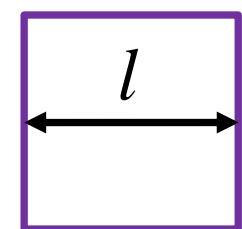
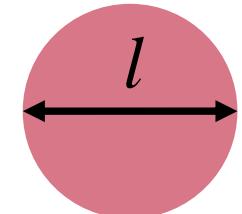
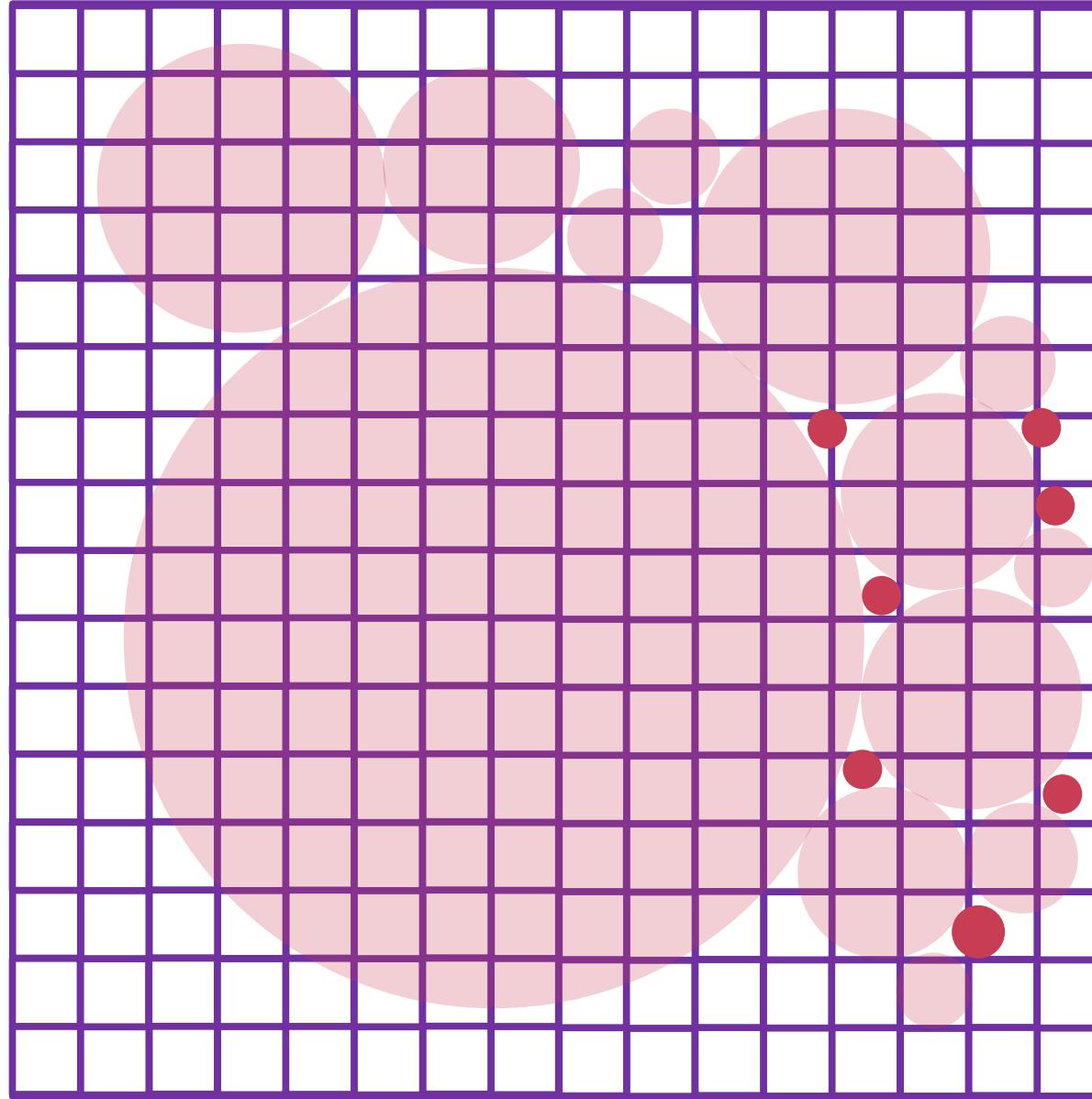
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# Our Algorithm

L  
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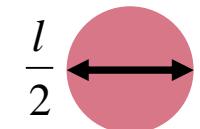
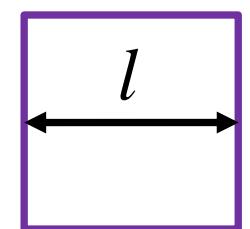
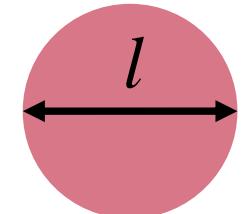
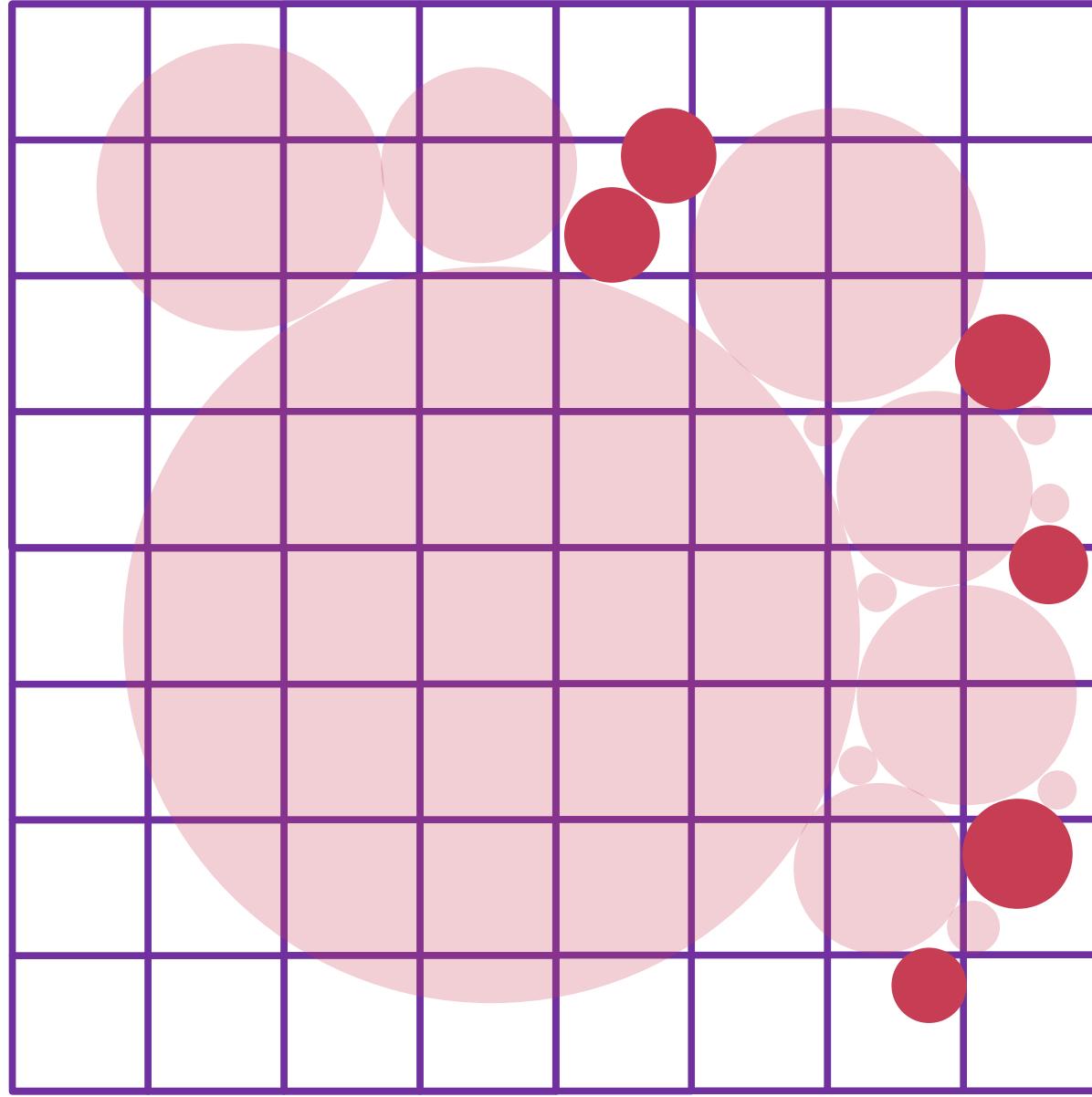
4



# Our Algorithm

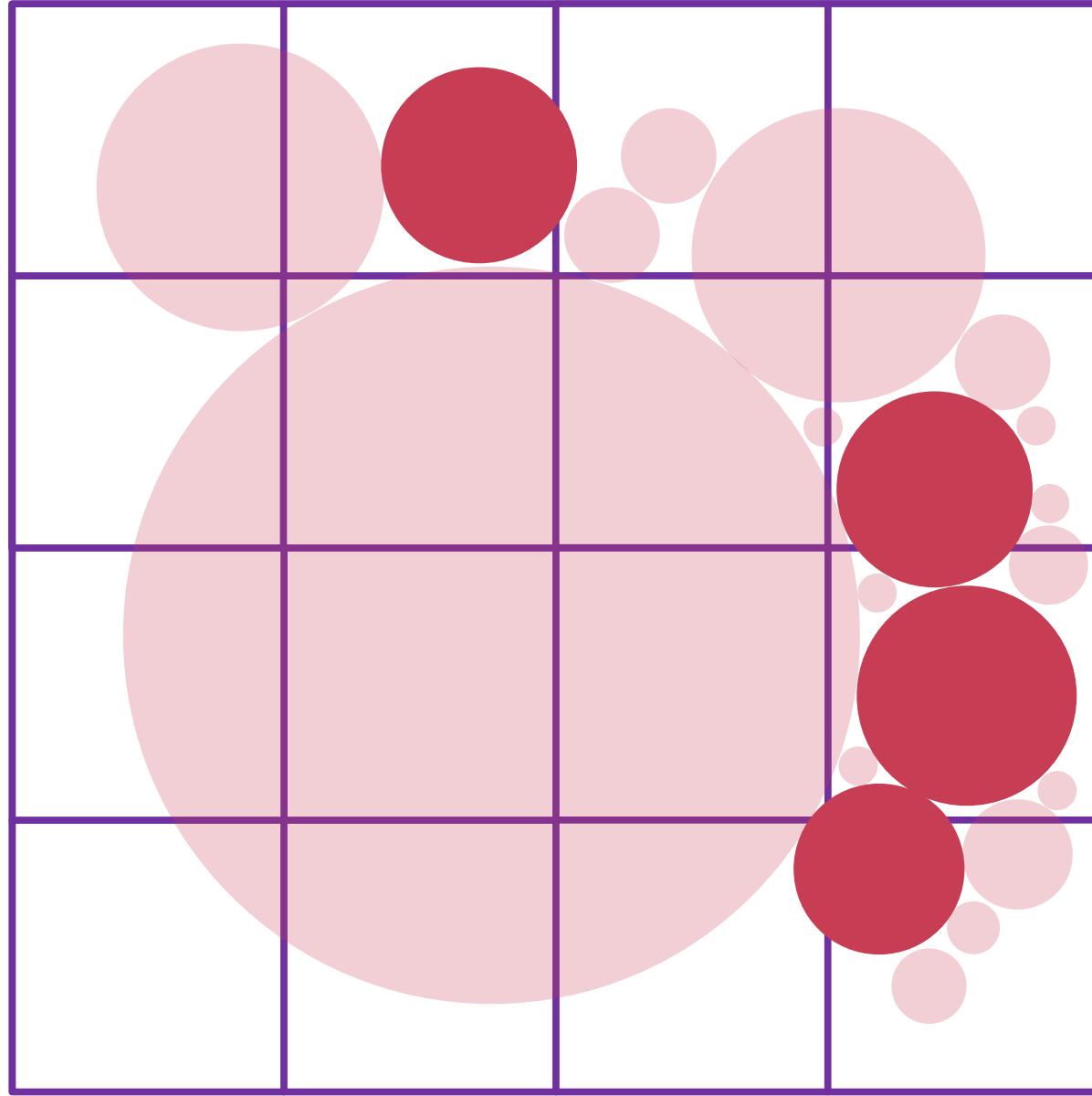
L  
e  
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l

3



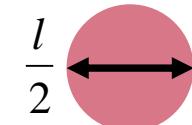
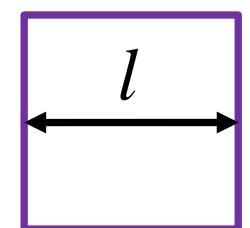
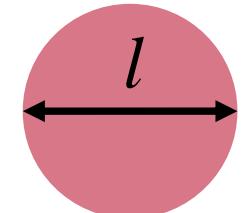
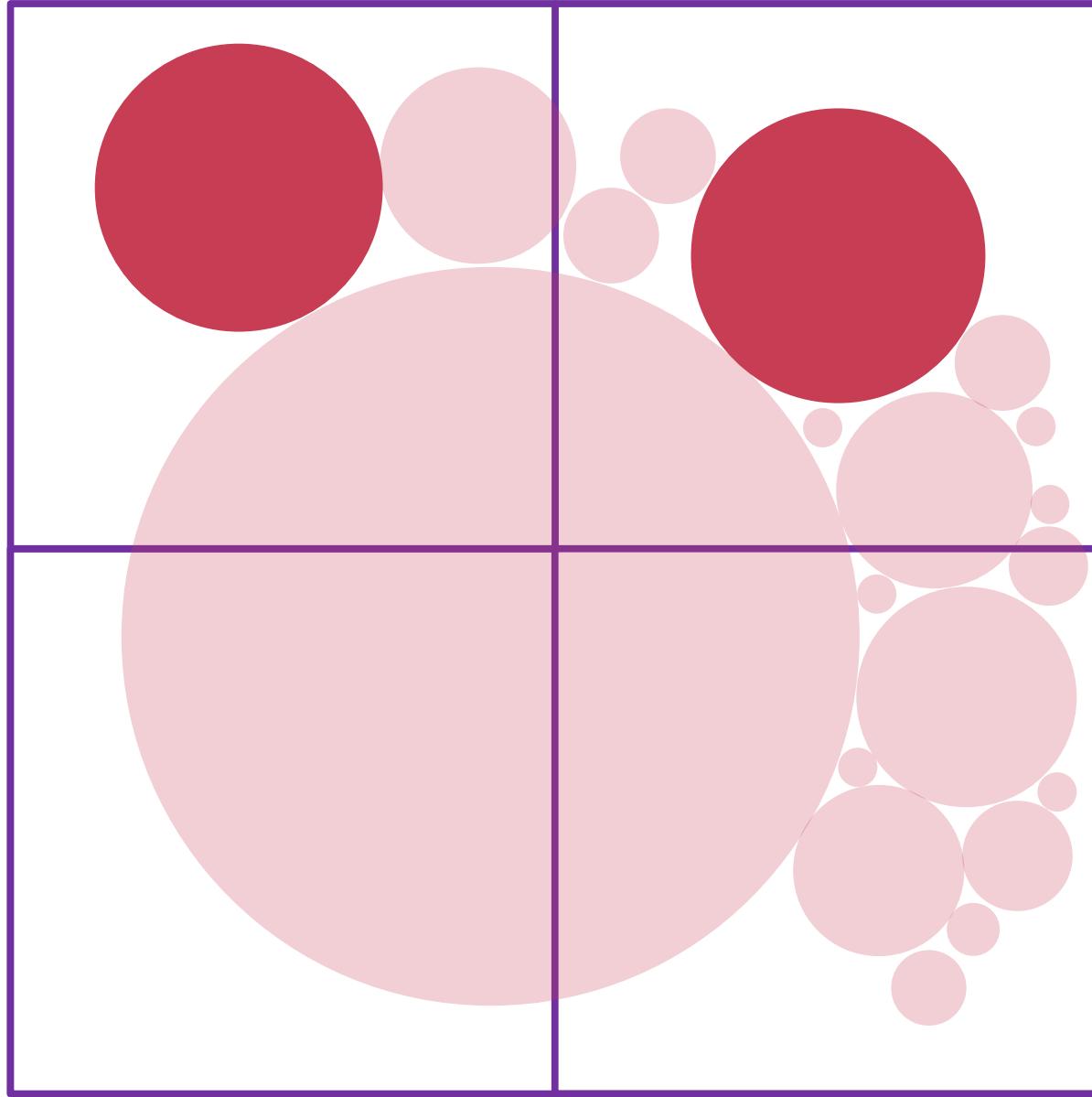
# Our Algorithm

Level 2



# Our Algorithm

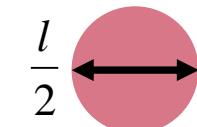
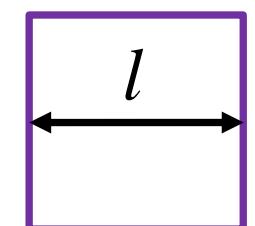
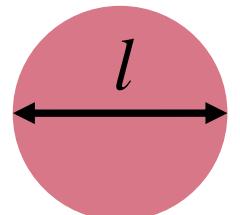
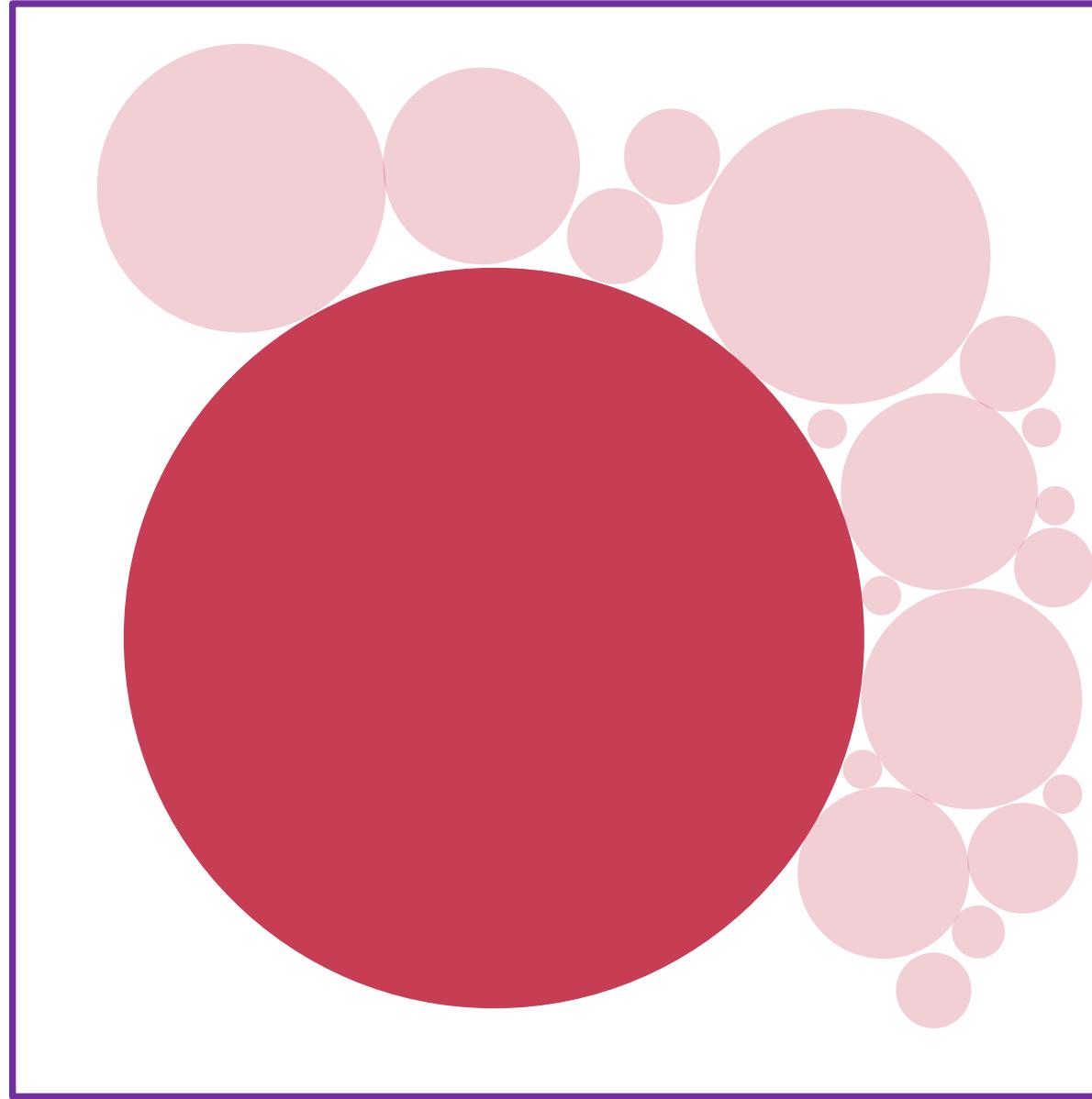
Level 1



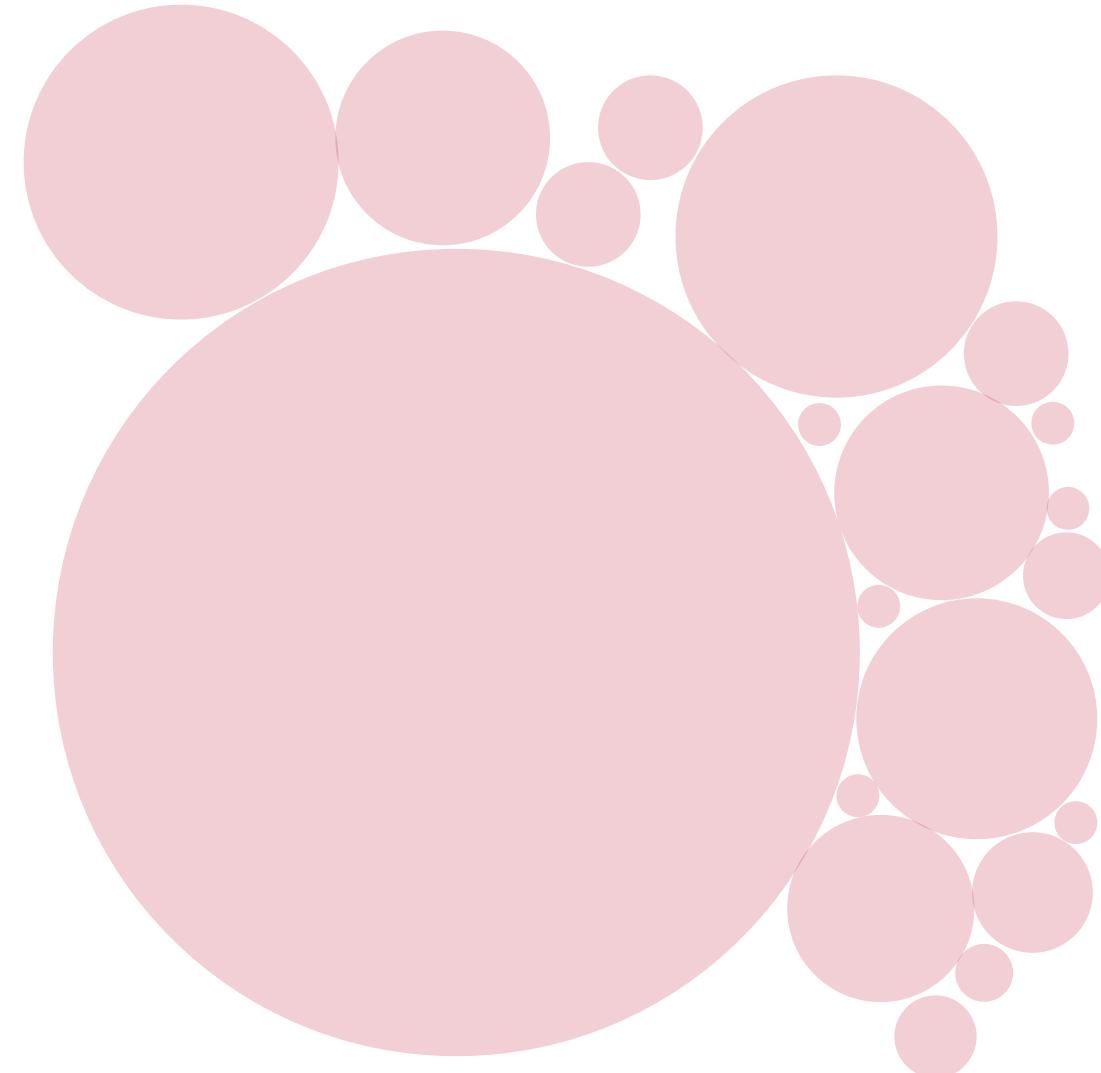
# Our Algorithm

Level

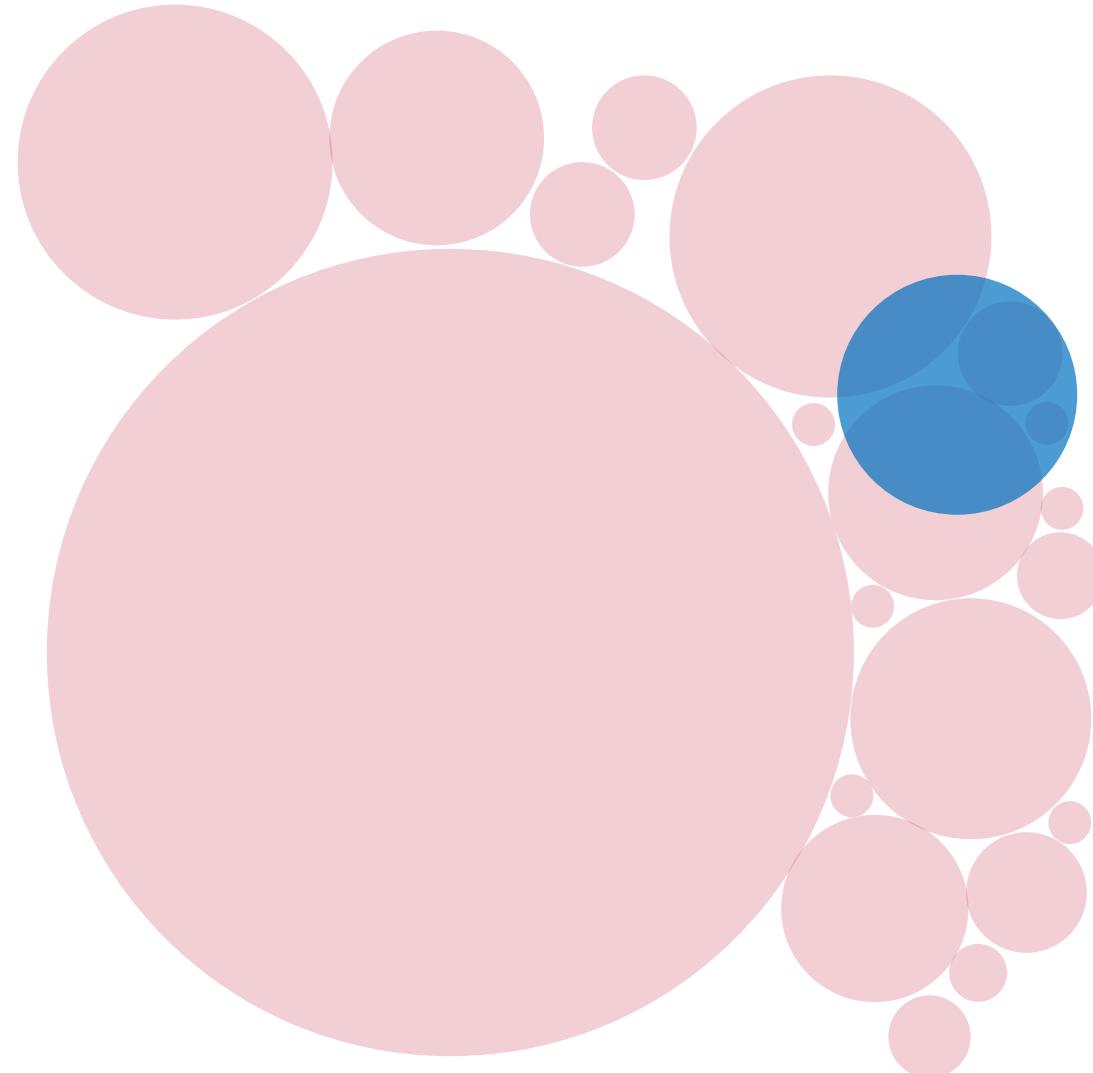
0



# Our Algorithm

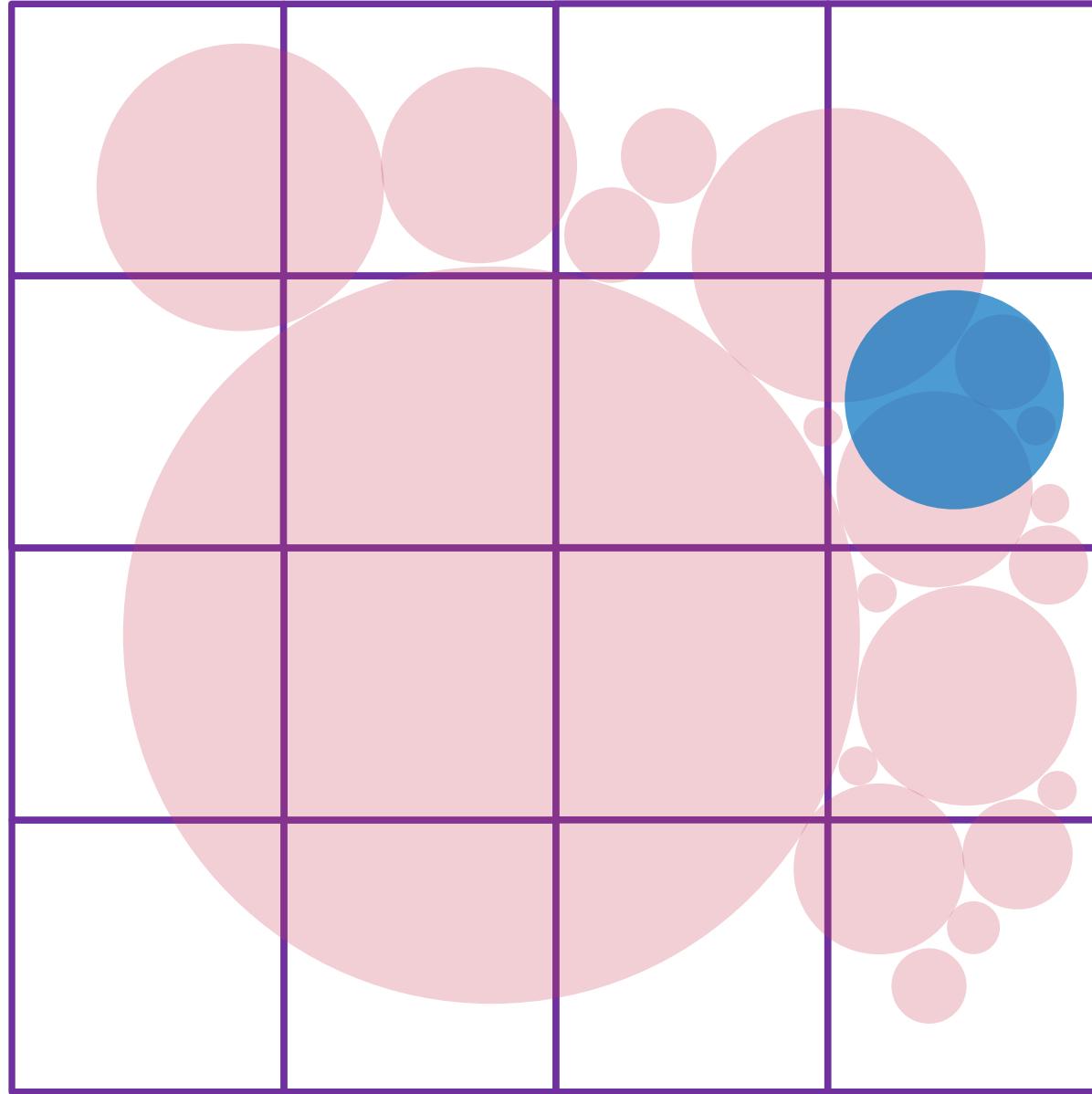


# Our Algorithm



# Our Algorithm

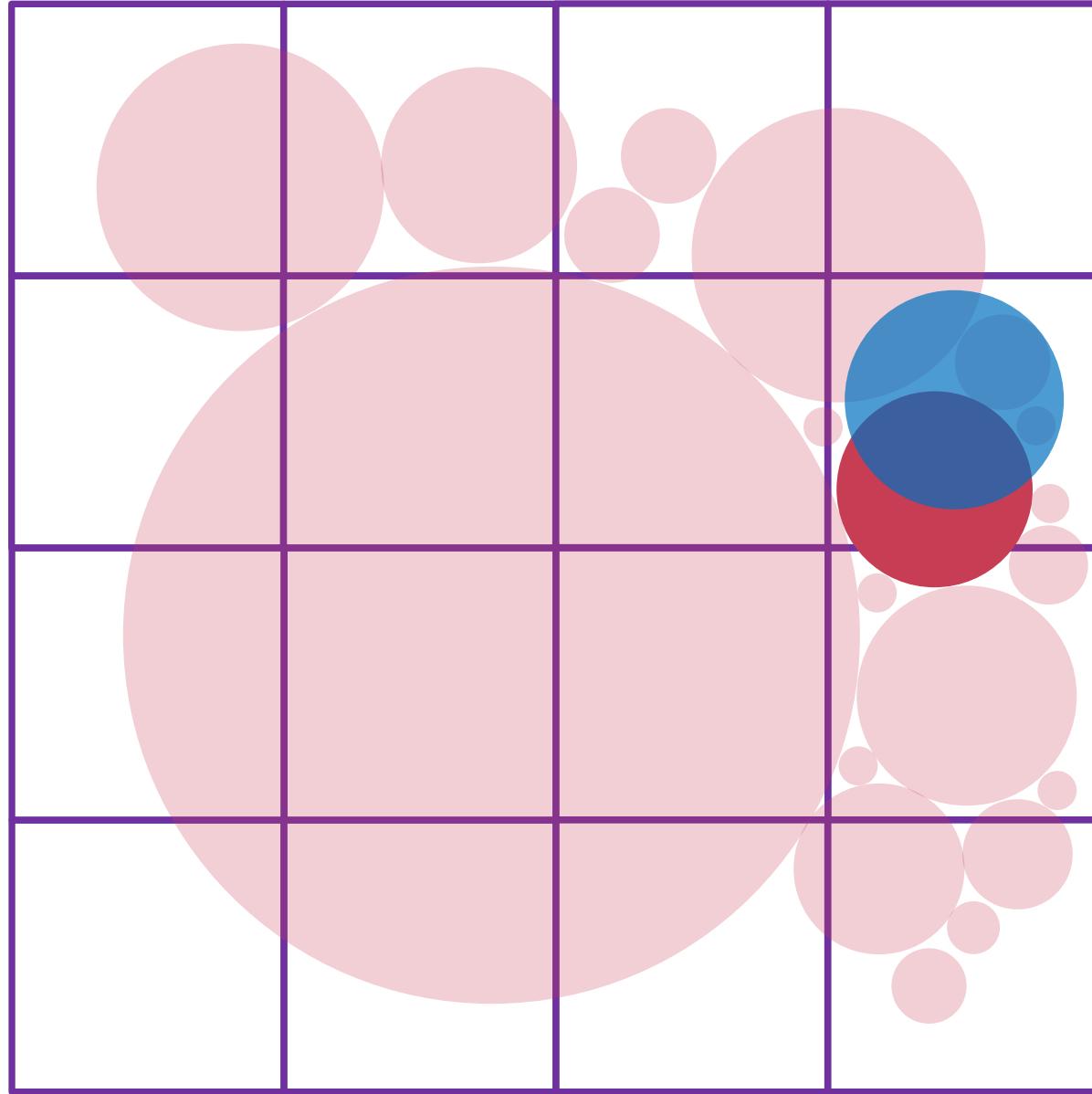
Level 2



# Our Algorithm

L  
e  
v  
e  
l

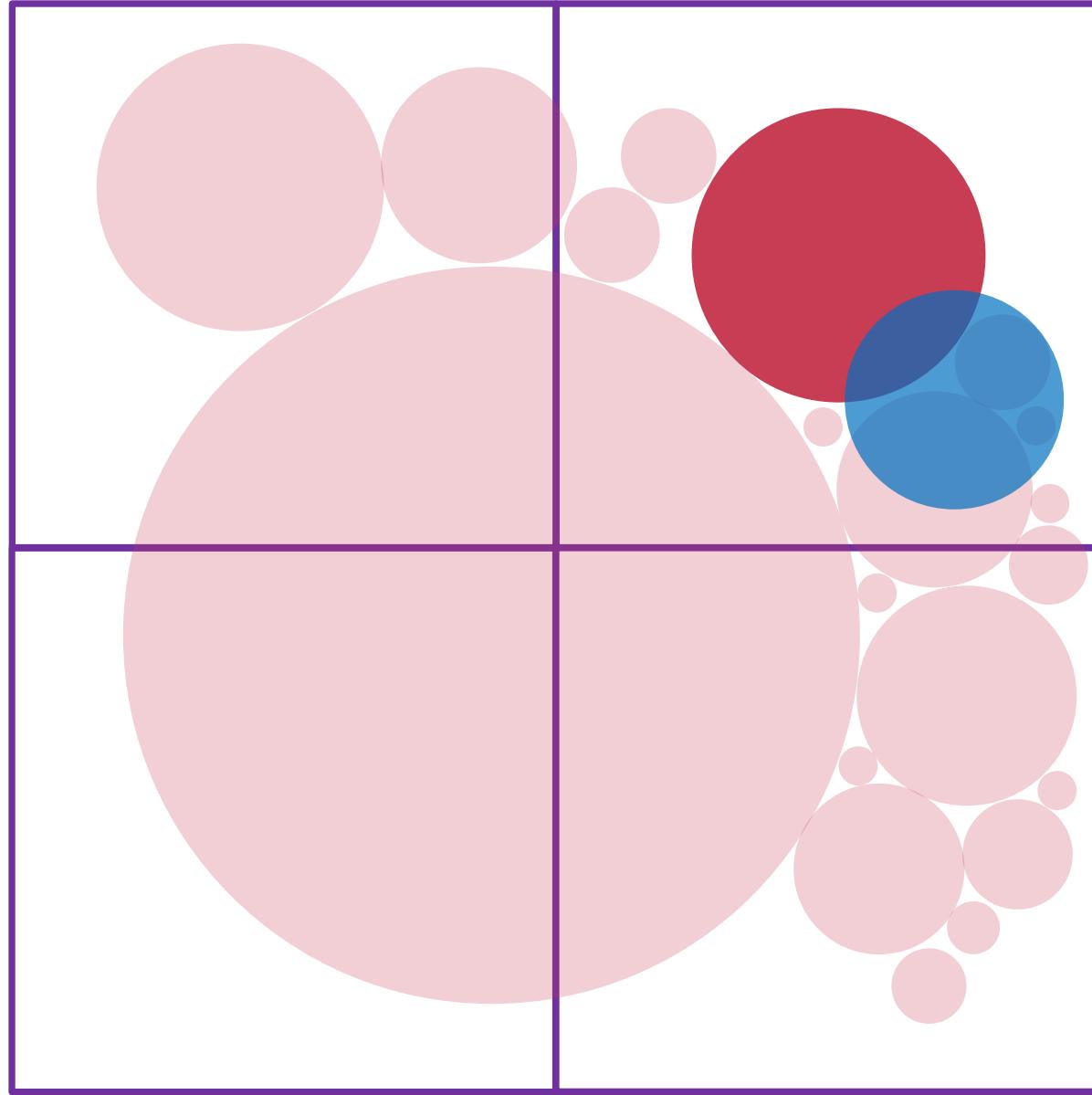
2



# Our Algorithm

Level

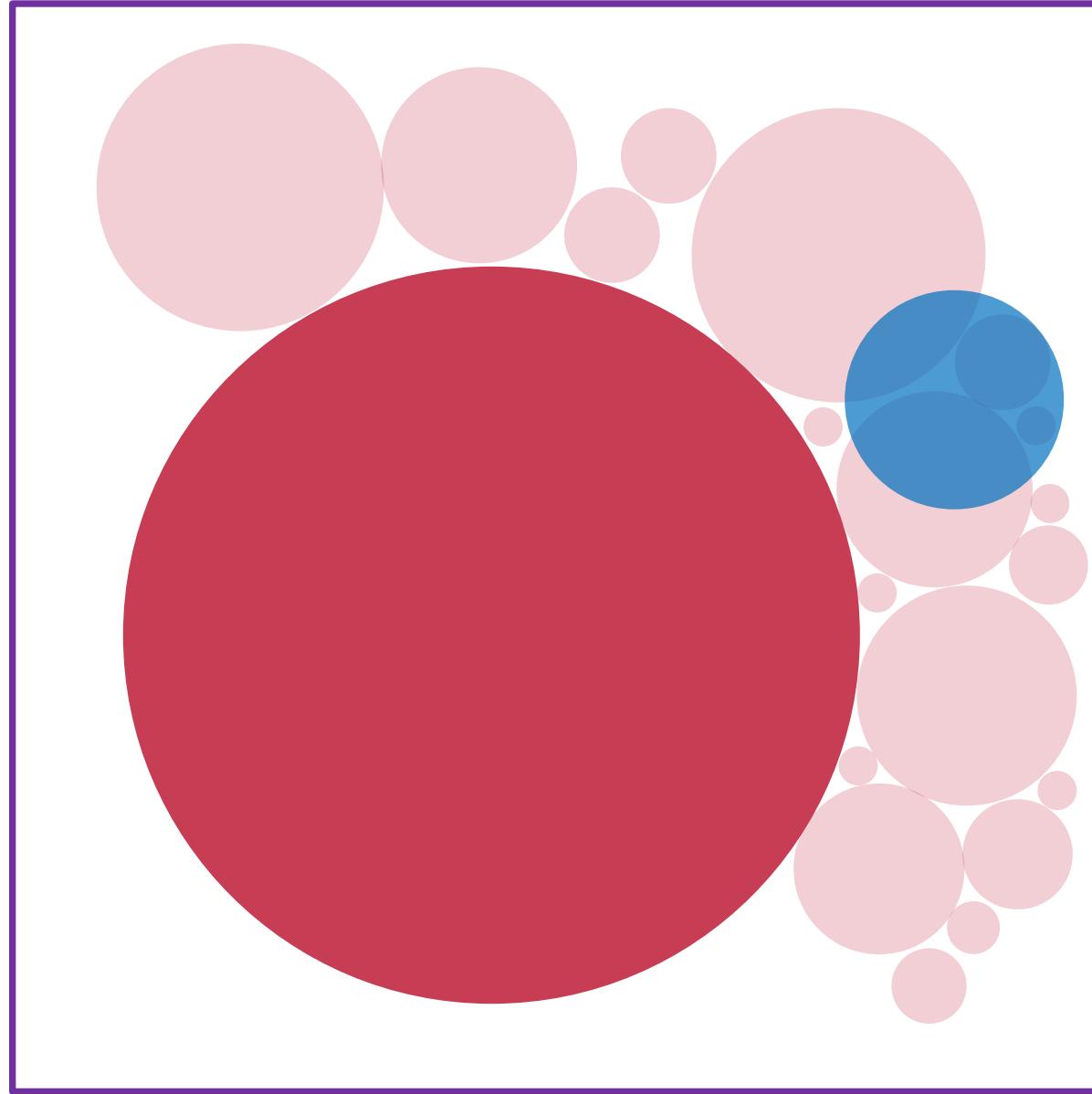
1



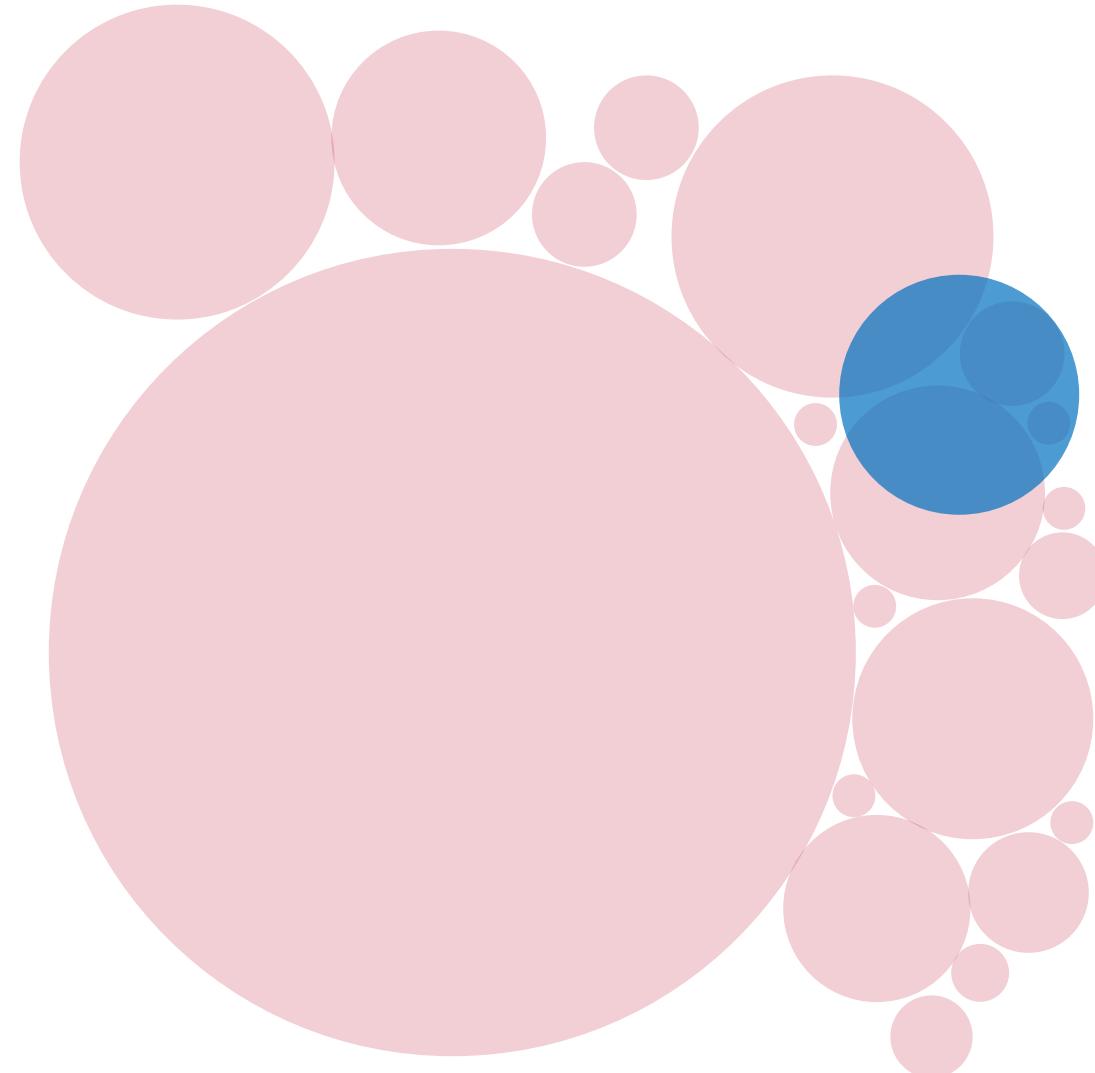
# Our Algorithm

L  
e  
v  
e  
l

0



# Our Algorithm





# Analysis

For each sphere  $s \in B$ :



# Analysis

For each sphere  $s \in B$ :

Compute hierarchy level l



# Analysis

For each sphere  $s \in B$ :

Compute hierarchy level  $l$

For all levels  $l \leq l_i \leq l_{\max}$ :



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Compute overlap volume for  $s$  and  $s_k$



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$\Rightarrow O(1)$



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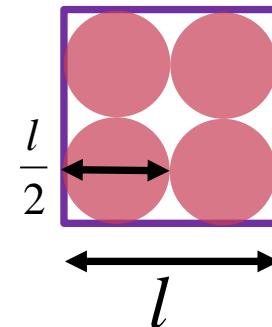
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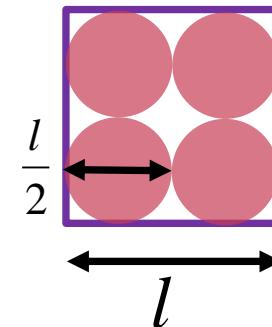
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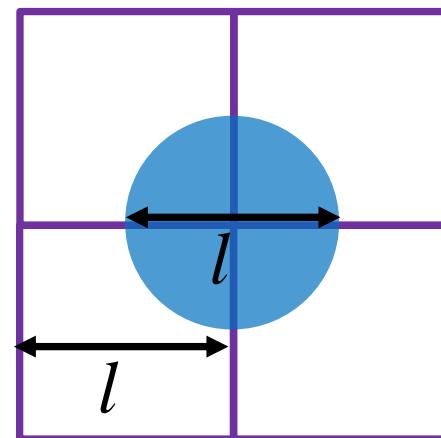
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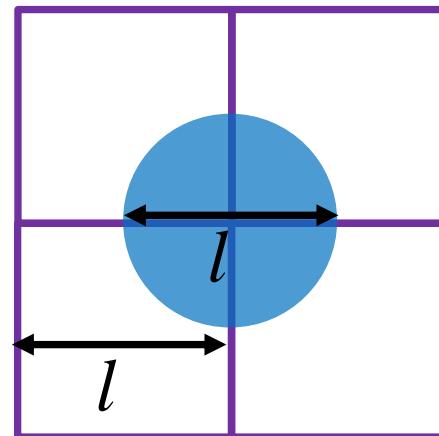
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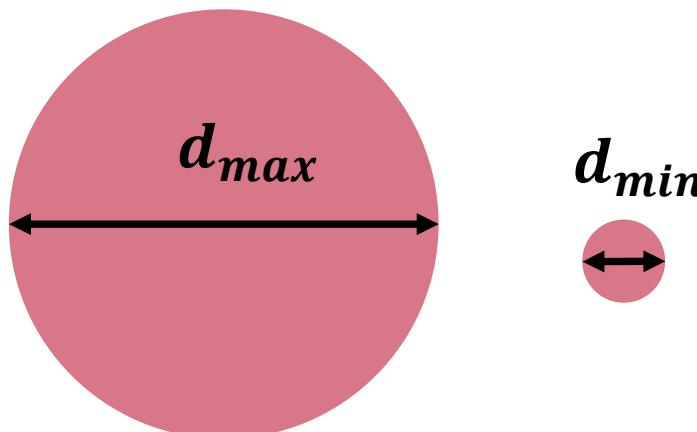
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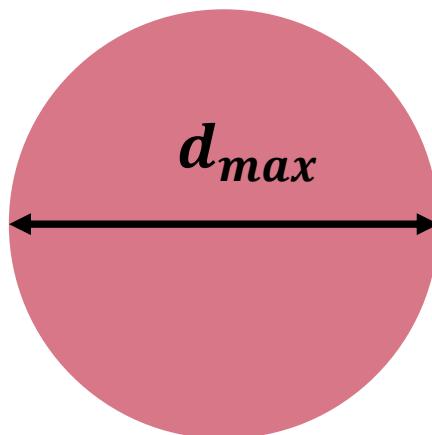
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$$d_{\min} \Rightarrow O\left(\log \frac{d_{\max}}{d_{\min}}\right)$$



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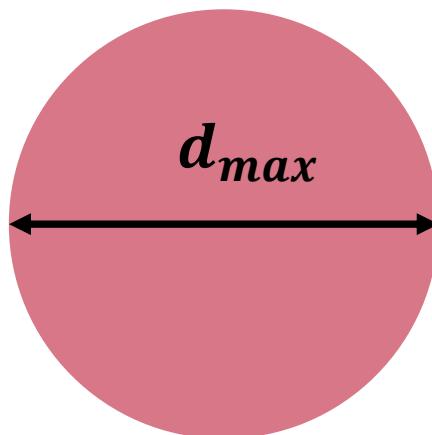
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# Analysis

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---

*Total Time:*  $O(n)$



# Analysis

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$\Rightarrow O(n)$

Compute hierarchy level  $l$

For all levels  $l \leq l_i \leq l_{\max}$ :

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Compute overlap volume for  $s$  and  $s_k$

$\Rightarrow O(1)$

---

*Total Time:*  $O(n)$



# Analysis

In Parallel for all spheres  $s \in B$ :

$\Rightarrow O(n)$

Compute hierarchy level  $l$

For all levels  $l \leq l_i \leq l_{\max}$ :

$\Rightarrow O(1)$

For all cells  $c_j$  in level  $l_i$  overlapped by  $s$

$\Rightarrow O(1)$

For all spheres  $s_k \in c_j$

$\Rightarrow O(1)$

Compute overlap volume for  $s$  and  $s_k$

$\Rightarrow O(1)$

---

Total Time:  $O(n)$



# Analysis

In Parallel for all spheres  $s \in B$ :

$\Rightarrow O(n)$

Compute hierarchy level  $l$

$\Rightarrow O(1)$

For all levels  $l \leq l_i \leq l_{\max}$ :

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For all cells  $c_j$  in level  $l_i$  overlapped by  $s$

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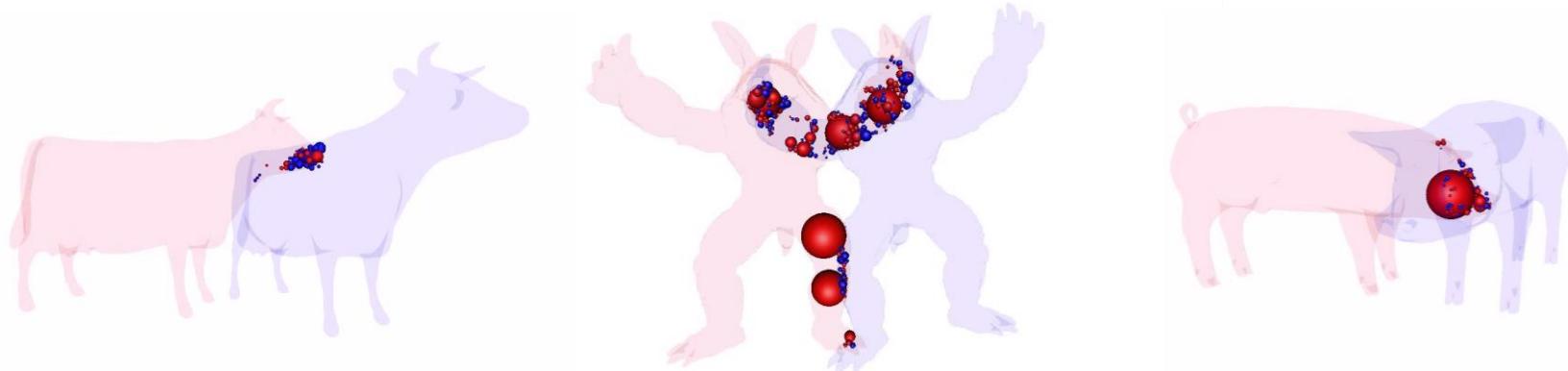
$\Rightarrow O(1)$

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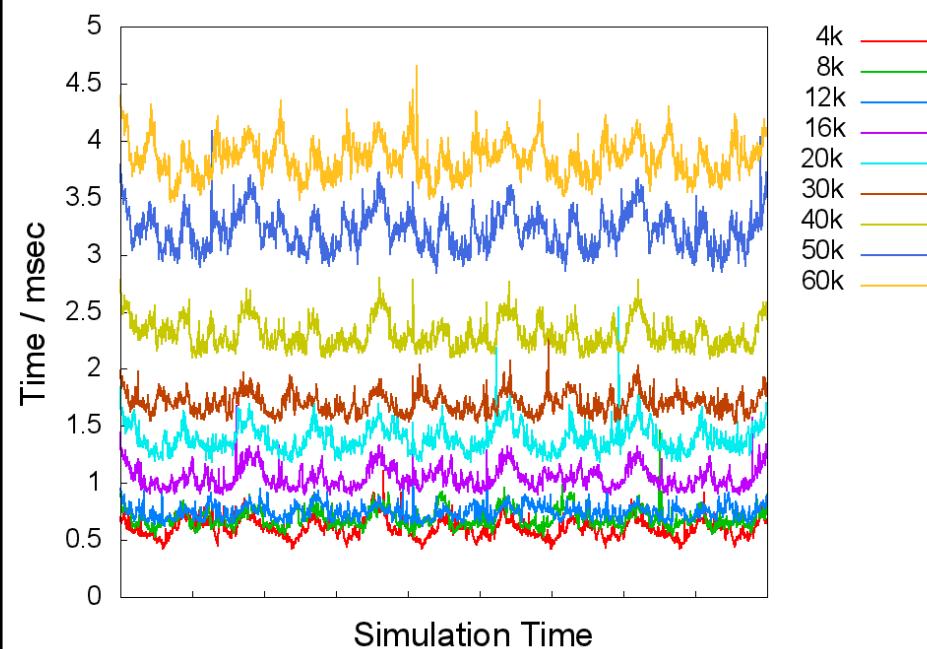
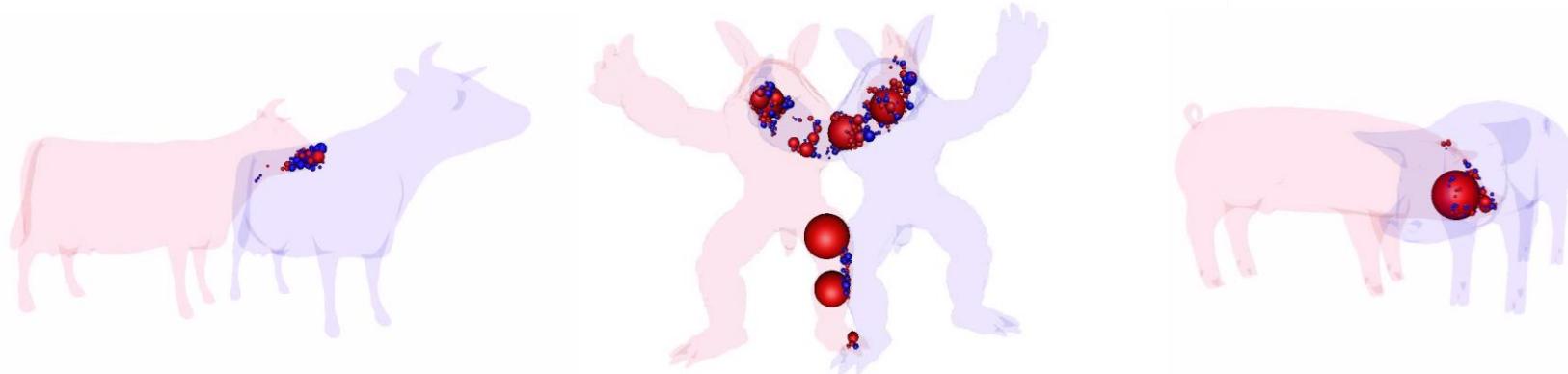
Total Time:  $O(n)$

Total Parallel Time:  $O(1)$

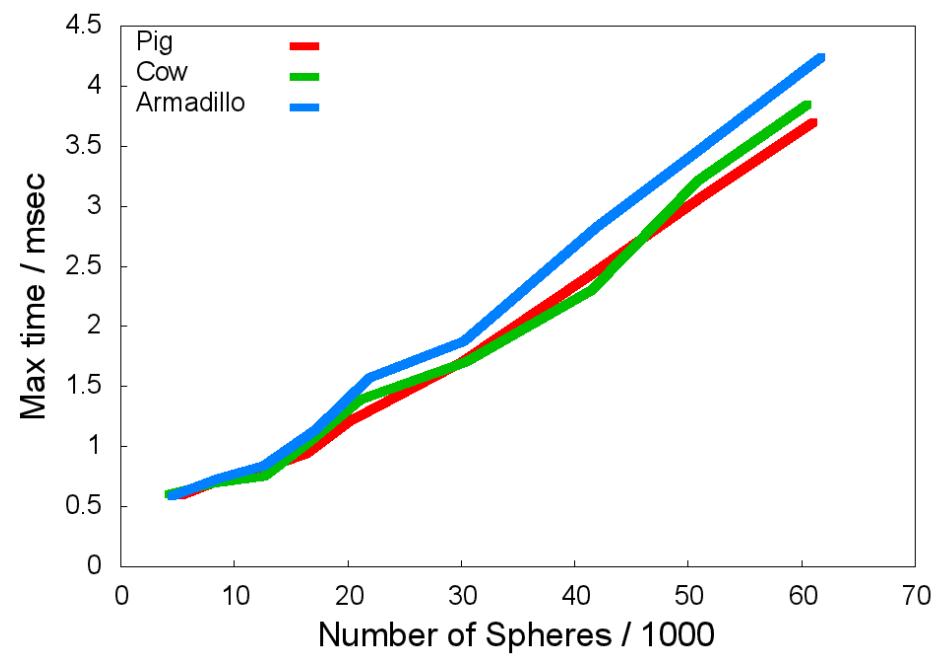
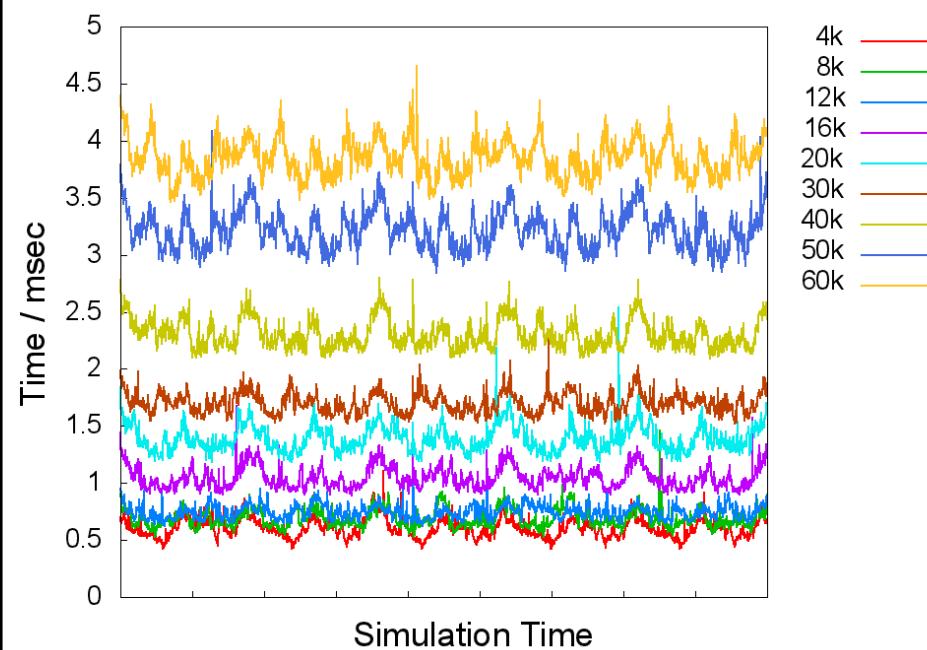
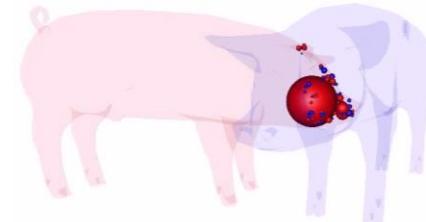
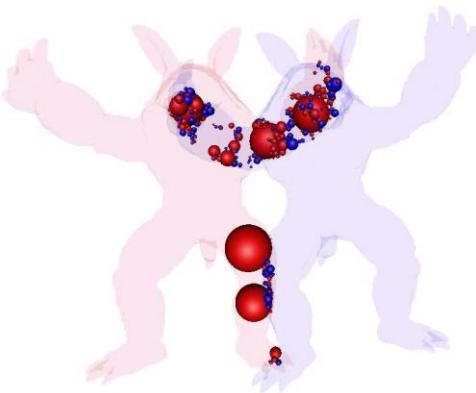
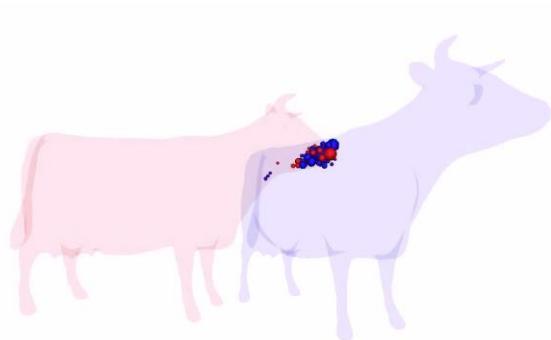
# Results



# Results

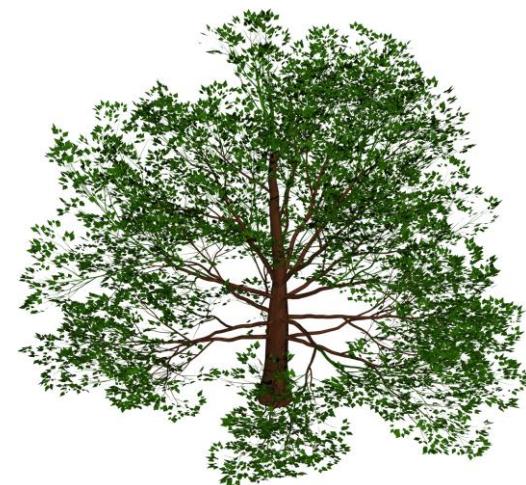
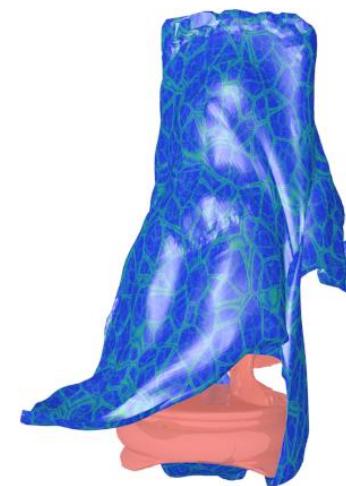


# Results

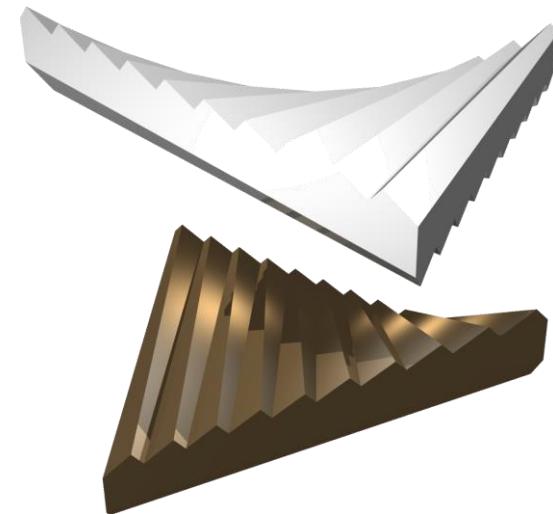


# Challenges

- Precondition for ISTs:
  - Watertight
  - Rigid (?)

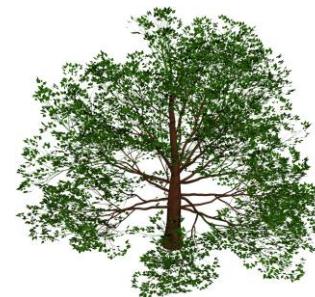
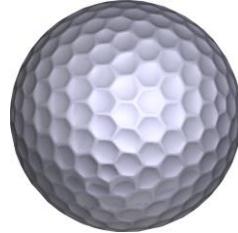


# Collision Detection Worst Case



$$O(n^2)$$

# What about these objects?

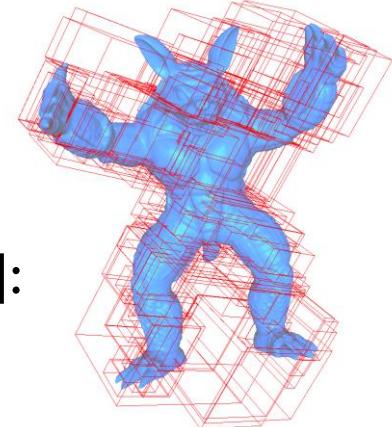


# Previous Works

- Distance of convex polytopes [Lin & Canny, 1991]:  
Worst case:  $O(\sqrt{n})$ ,  $n = \# \text{ faces}$

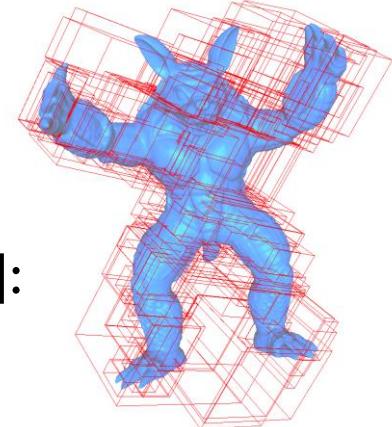
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Worst case:  $O(\sqrt{n})$ ,  $n = \# \text{ faces}$
- All intersections of  $n$  convex polytopes [Suri et al., 1998]:  
 $O((n + k) \log^2 n)$ ,  $k = \# \text{ intersecting pairs}$



# Previous Works

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Worst case:  $O(\sqrt{n})$ ,  $n = \# \text{ faces}$
- All intersections of  $n$  convex polytopes [Suri et al., 1998]:  
 $O((n + k) \log^2 n)$ ,  $k = \# \text{ intersecting pairs}$
- Expected  $O(\log n)$  depending on bounding volume and object configuration [Weller et al., 2006]



# Our Contribution

- A novel **geometric predicate** that defines a class of „well-shaped“ objects



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- A novel **geometric predicate** that defines a class of „well-shaped“ objects



- **Proof** to show that objects in that class have  $O(n)$  intersections

# Our Contribution

- A novel **geometric predicate** that defines a class of „well-shaped“ objects
  - Predicate needs to consider only a single object
  - Easy to check
  - Contains (almost) all practically relevant objects
- **Proof** to show that objects in that class have  $O(n)$  intersections



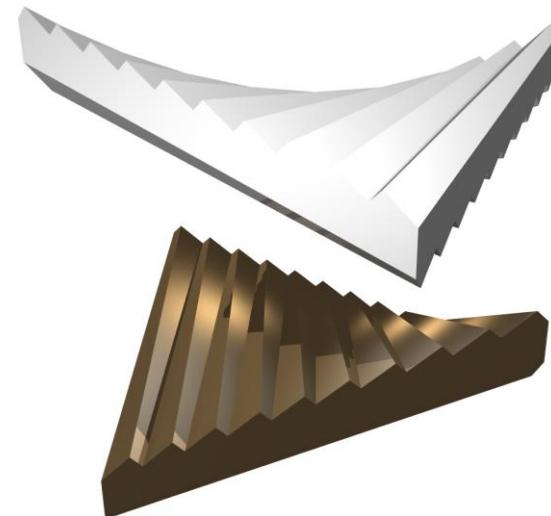
# Our Contribution

- A novel **geometric predicate** that defines a class of „well-shaped“ objects
  - Predicate needs to consider only a single object
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  - Contains (almost) all practically relevant objects
- **Proof** to show that objects in that class have  $O(n)$  intersections
- New **algorithm** with (almost) linear running time for objects fulfilling our predicate



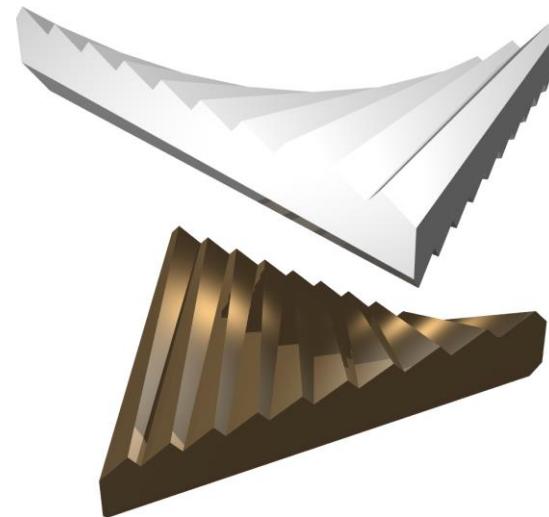
# Basic Idea

- What makes objects like the Chazelle polyhedron so complex to check for collision?



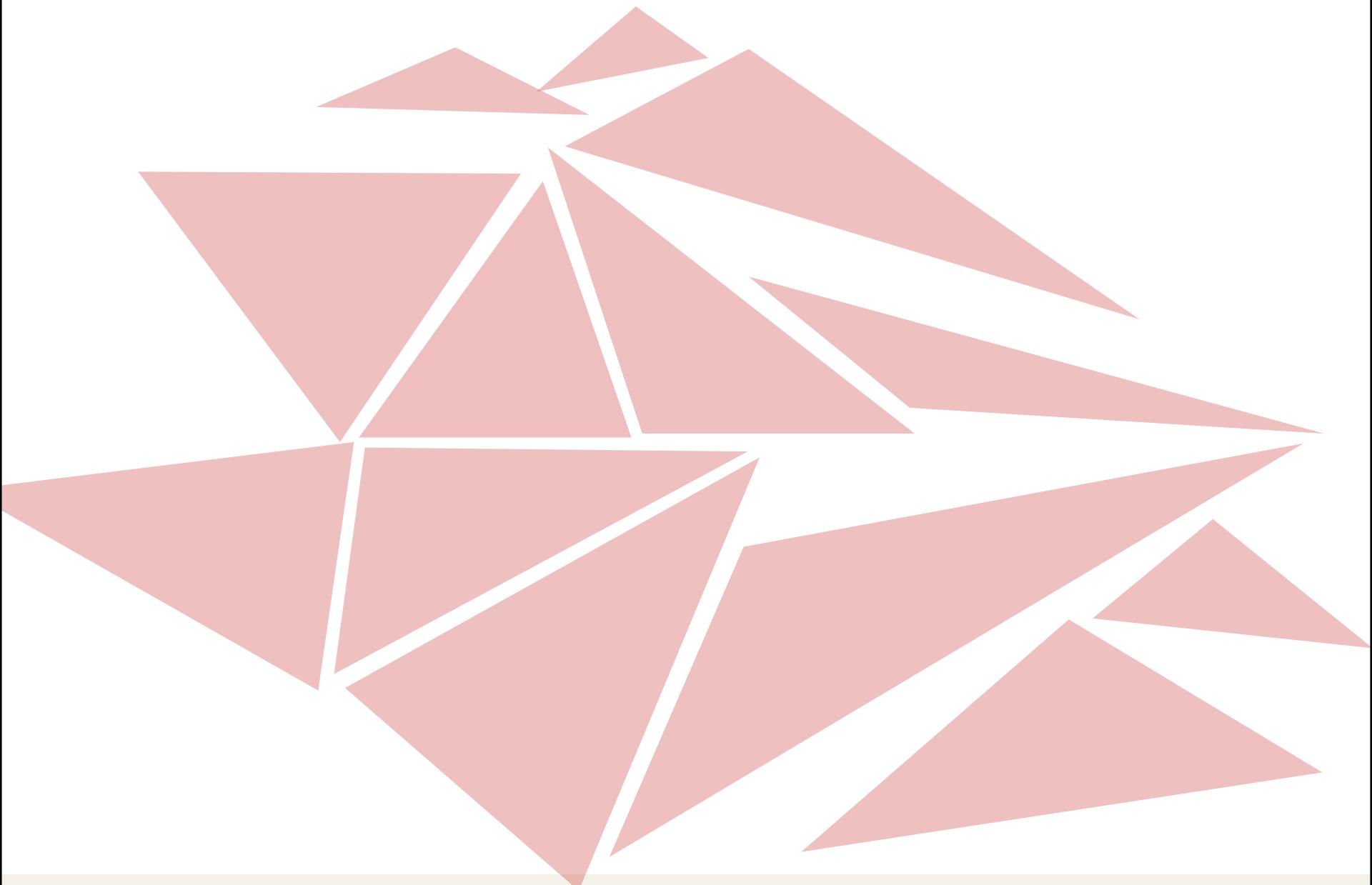
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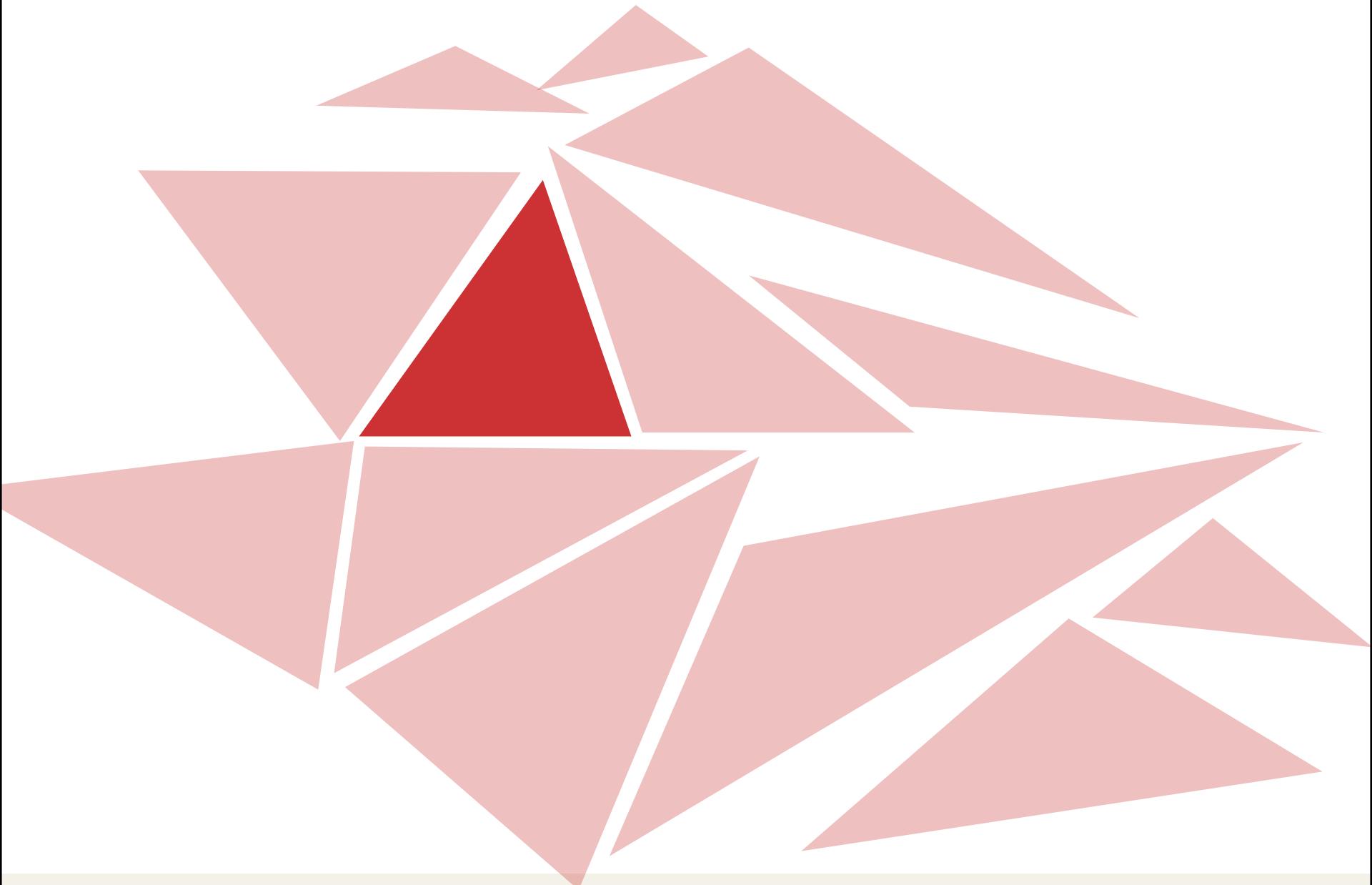


- There can be  $O(n)$  polygons in the neighbourhood of each polygon

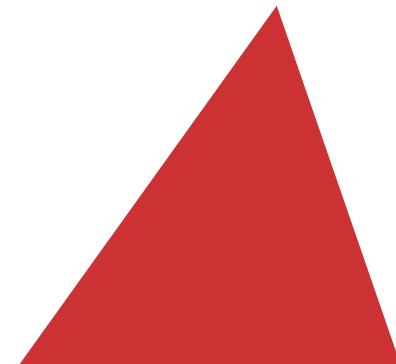
# Our Geometric Predicate



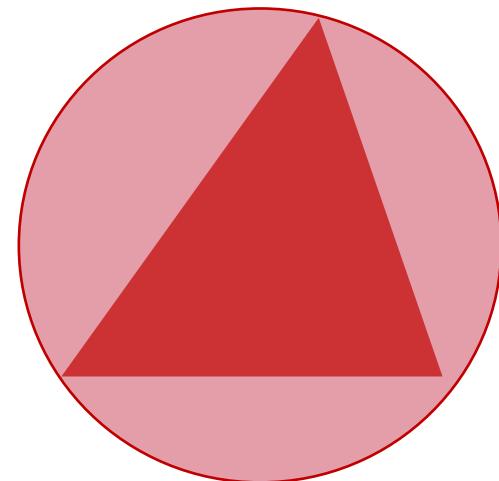
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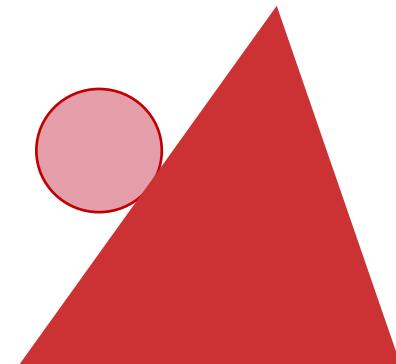
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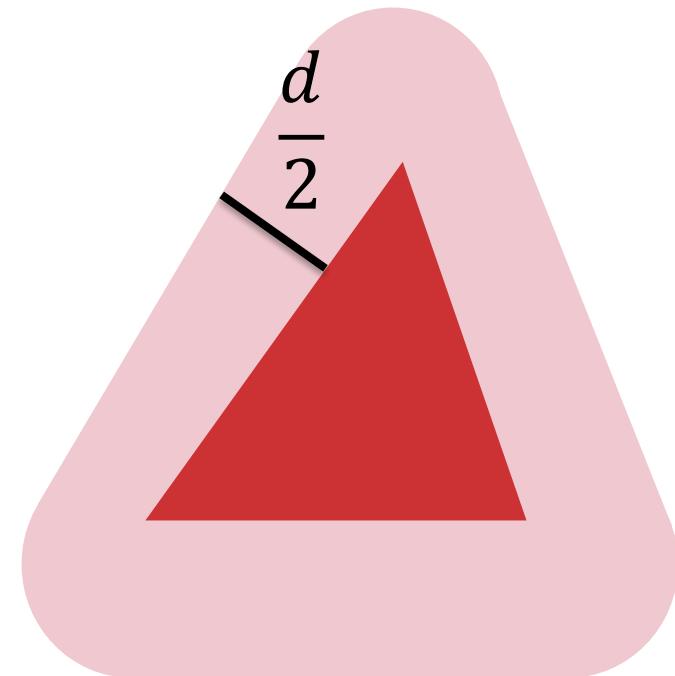
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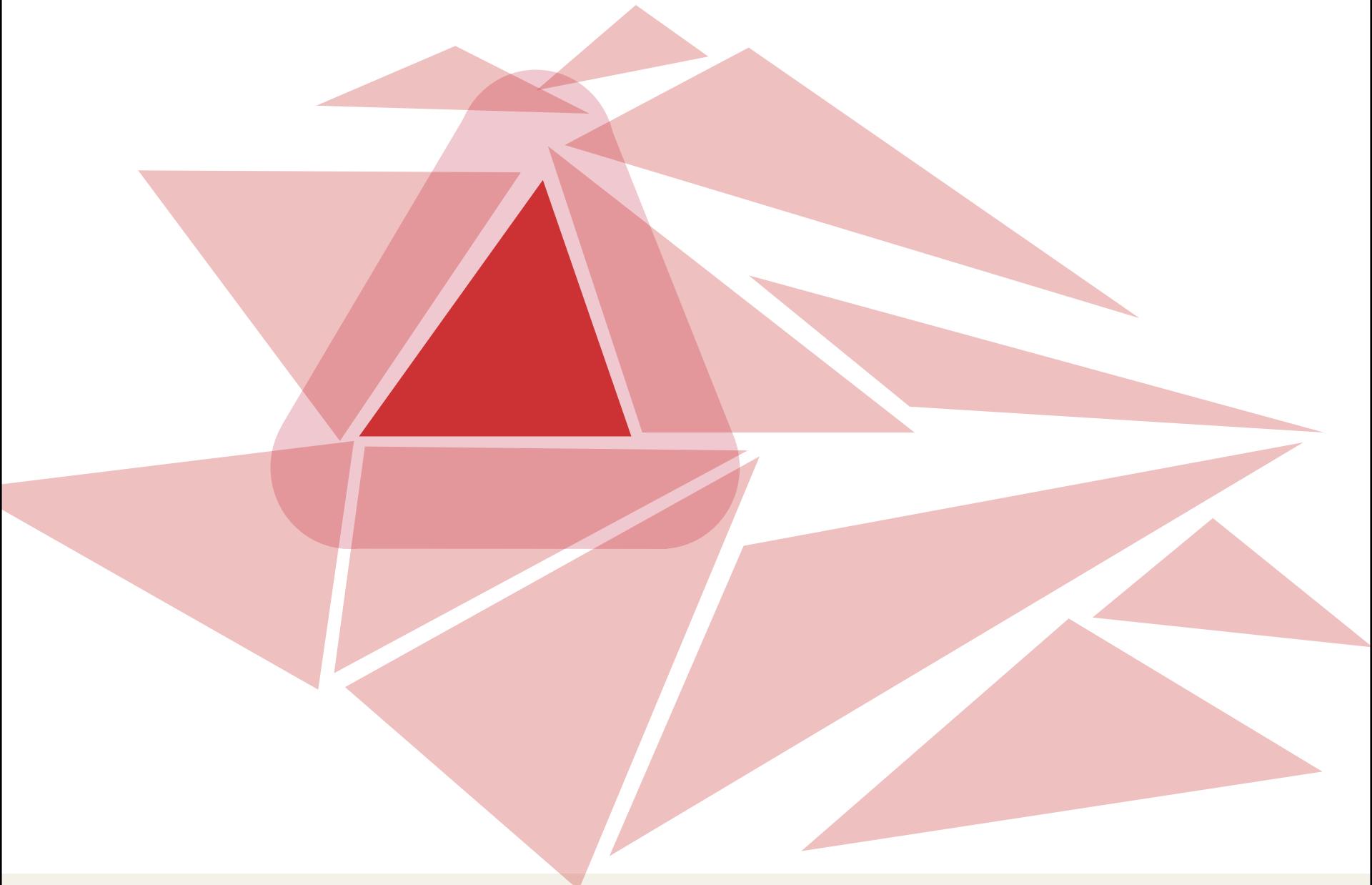
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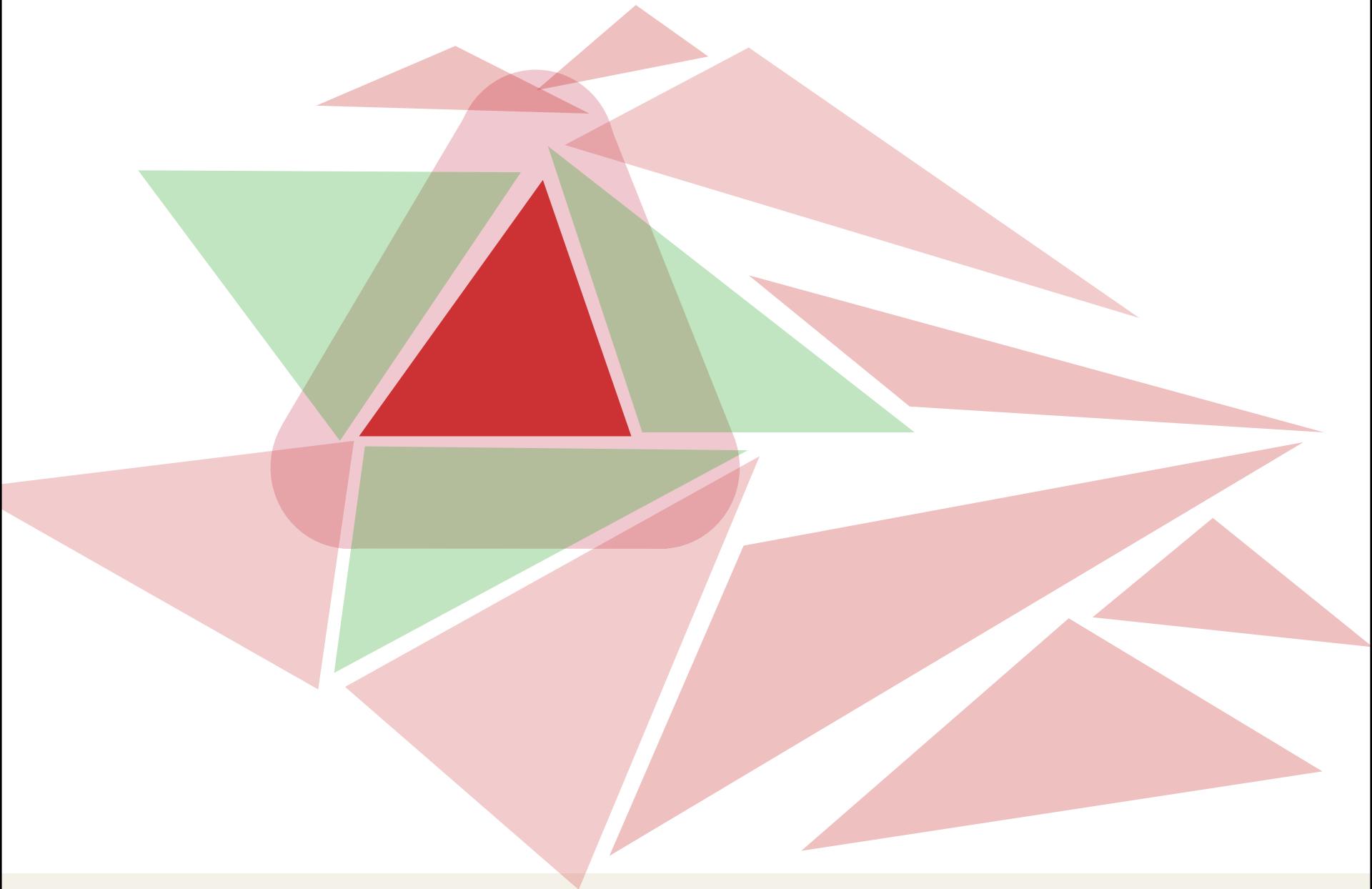
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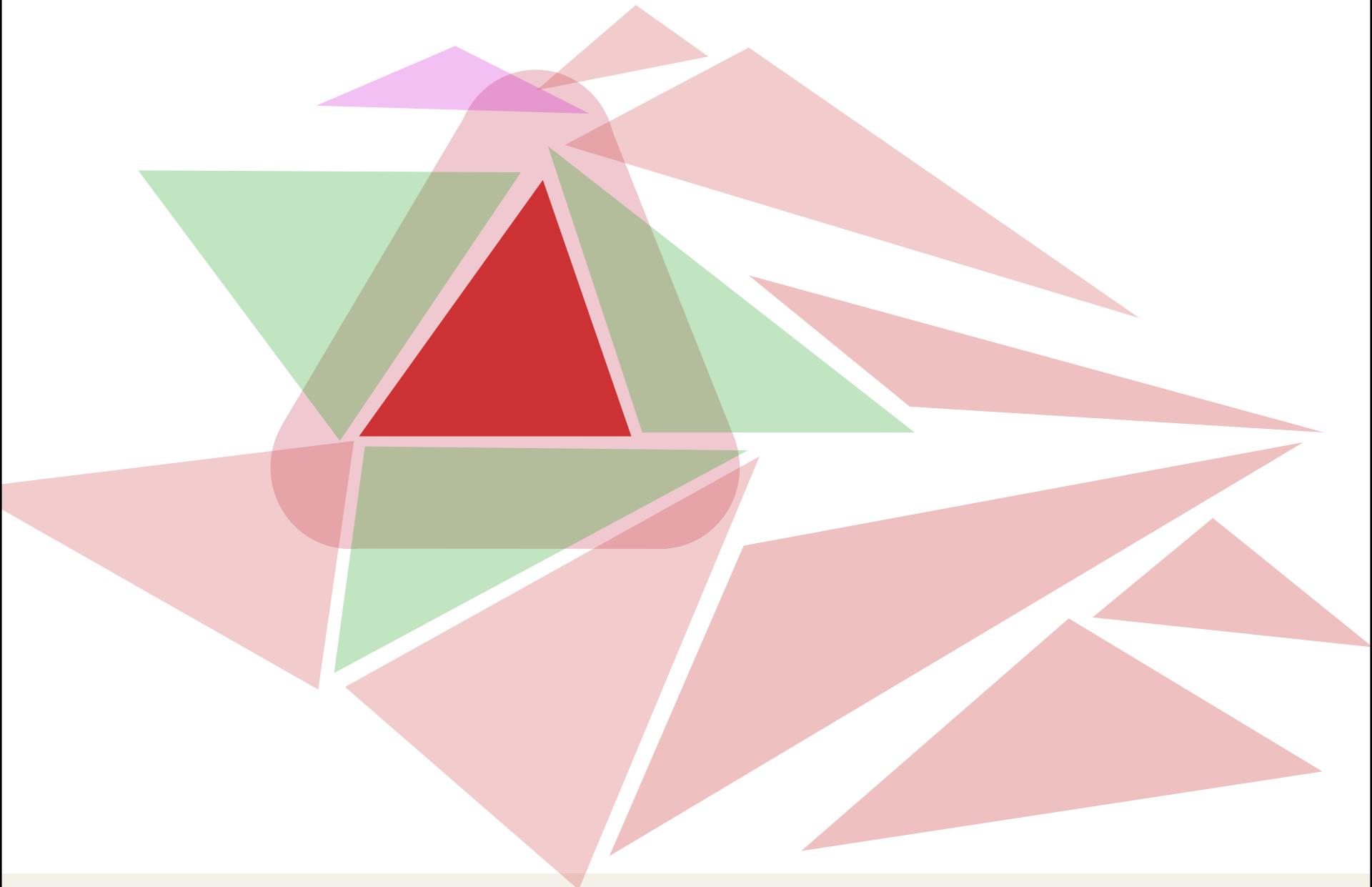
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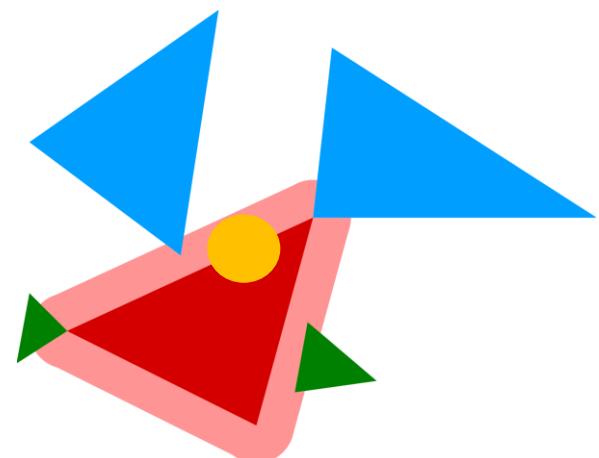


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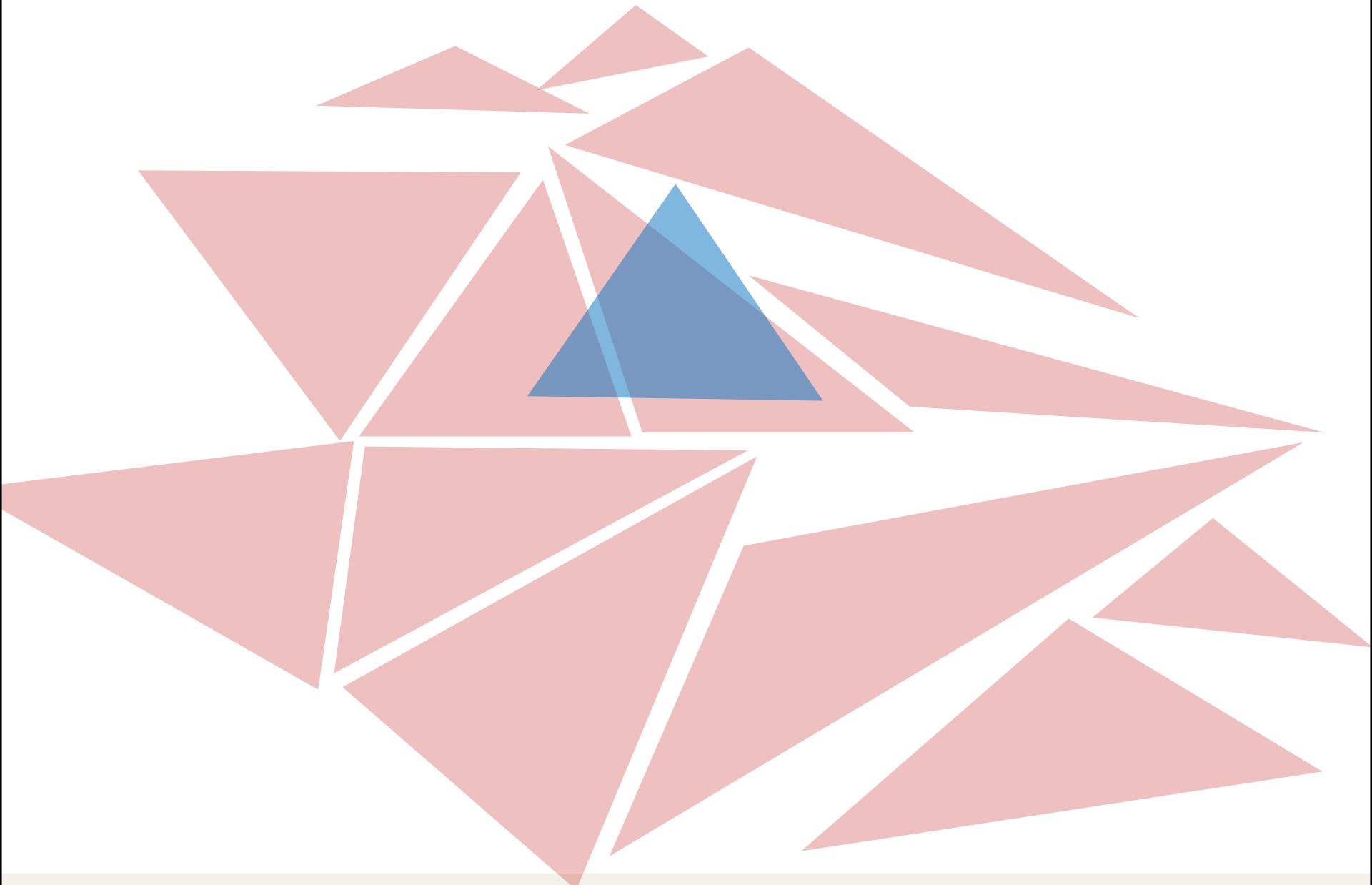


# Definition: $k$ -free

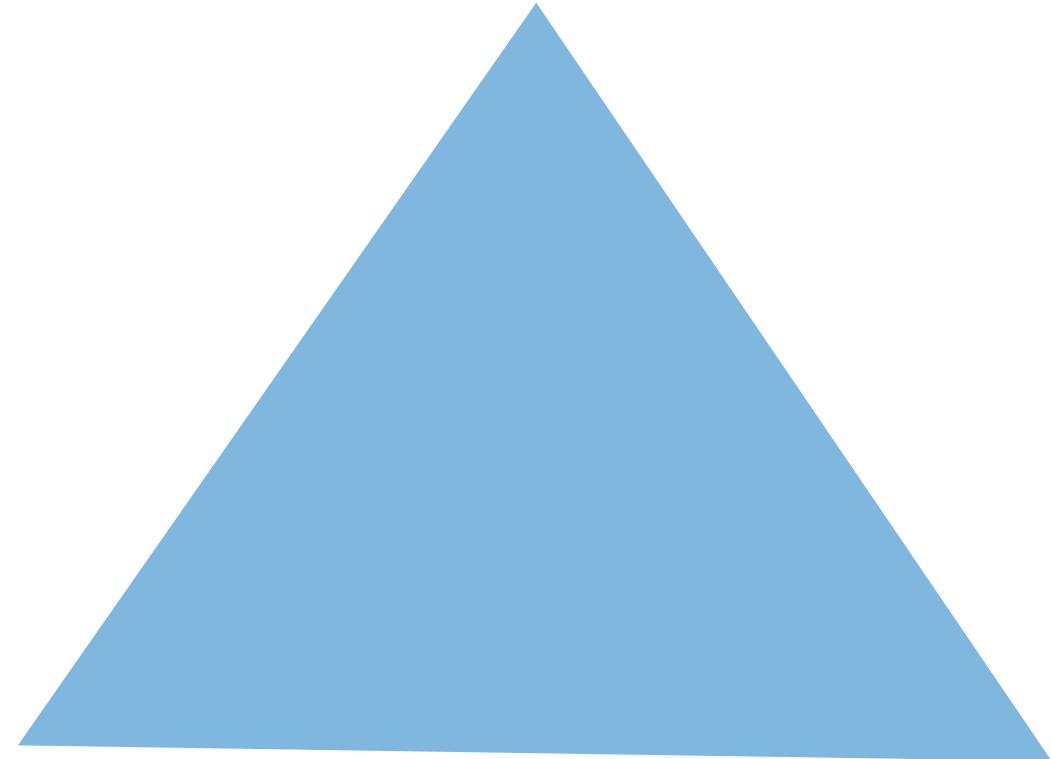
- Let  $t \in A$  be a triangle in a triangle set  $A$  and  $k > 0$  some constant. Let  $s$  be a sphere with diameter  $\frac{d}{2}$ , where  $d$  is the diameter of the smallest enclosing sphere of  $t$ . We call  $t$   **$k$ -free** if  $|\{t_j \in A; r \leq r_j \text{ and } t_j \cap (t \oplus s) \neq \emptyset\}| < k$  where  $d_j$  is diameter of the smallest enclosing sphere of triangle  $t_j$  and  $t \oplus s$  is the Minkowski sum of  $s$  and  $t$ .
- Accordingly, we call the whole set of triangles  $A$   **$k$ -free**, if all triangles  $t_j \in A$  are  $k$ -free.



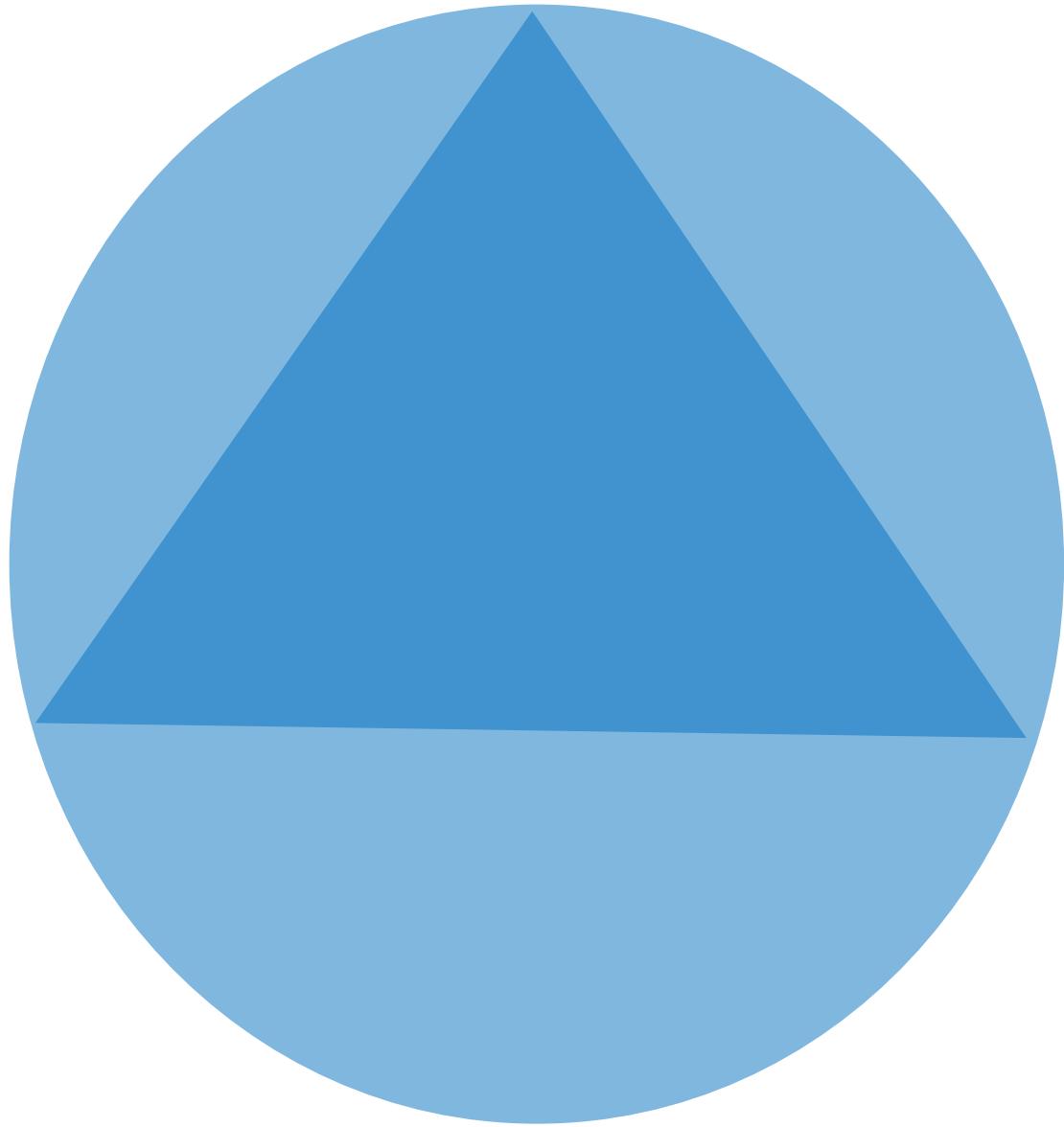
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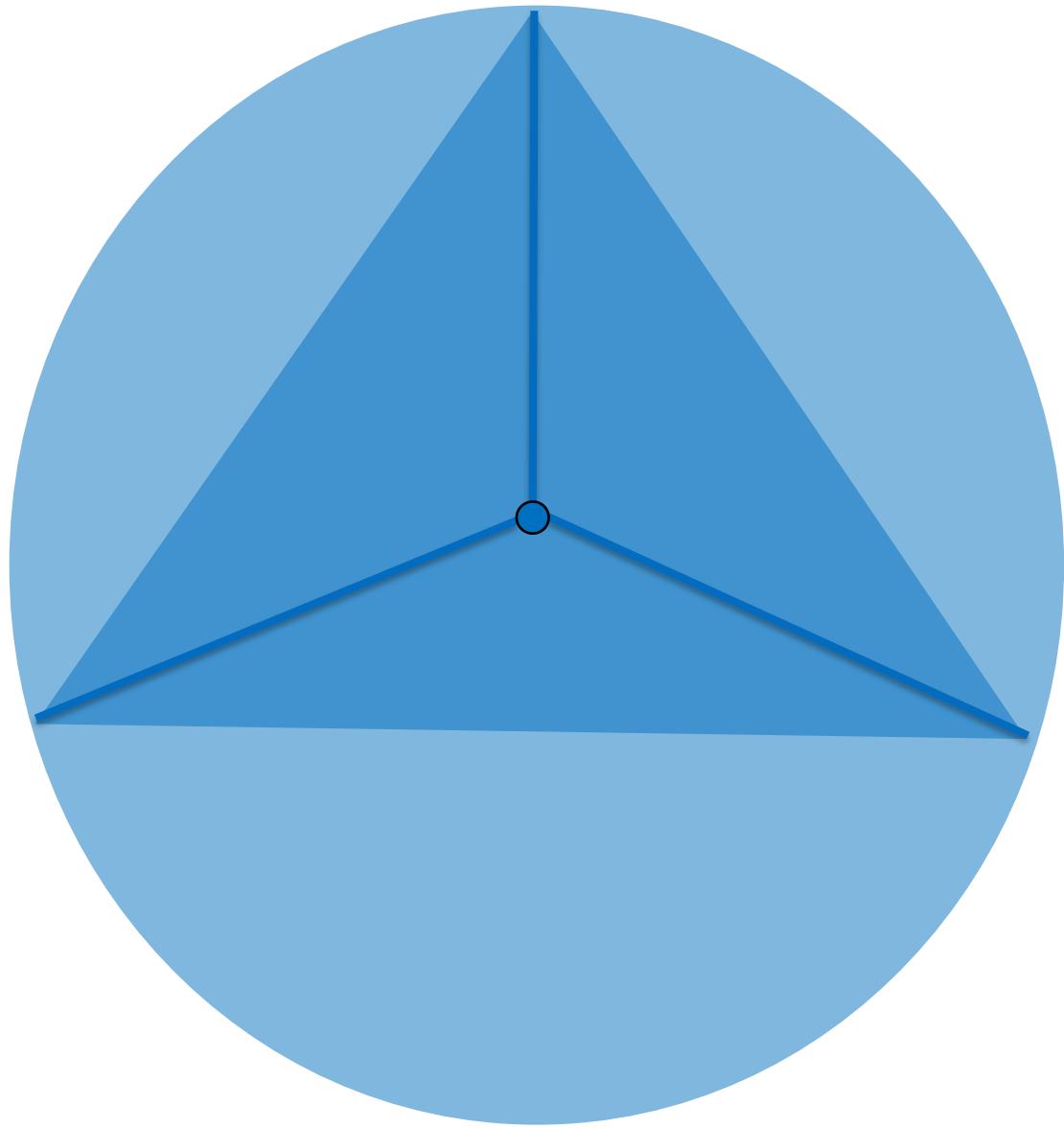
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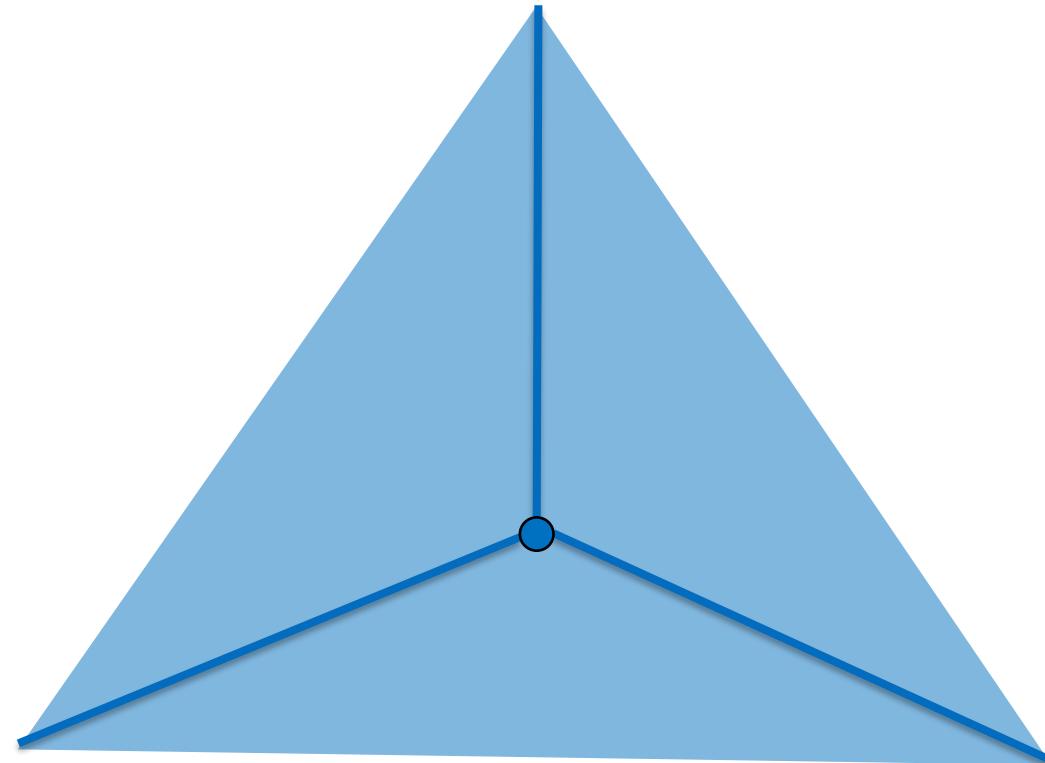
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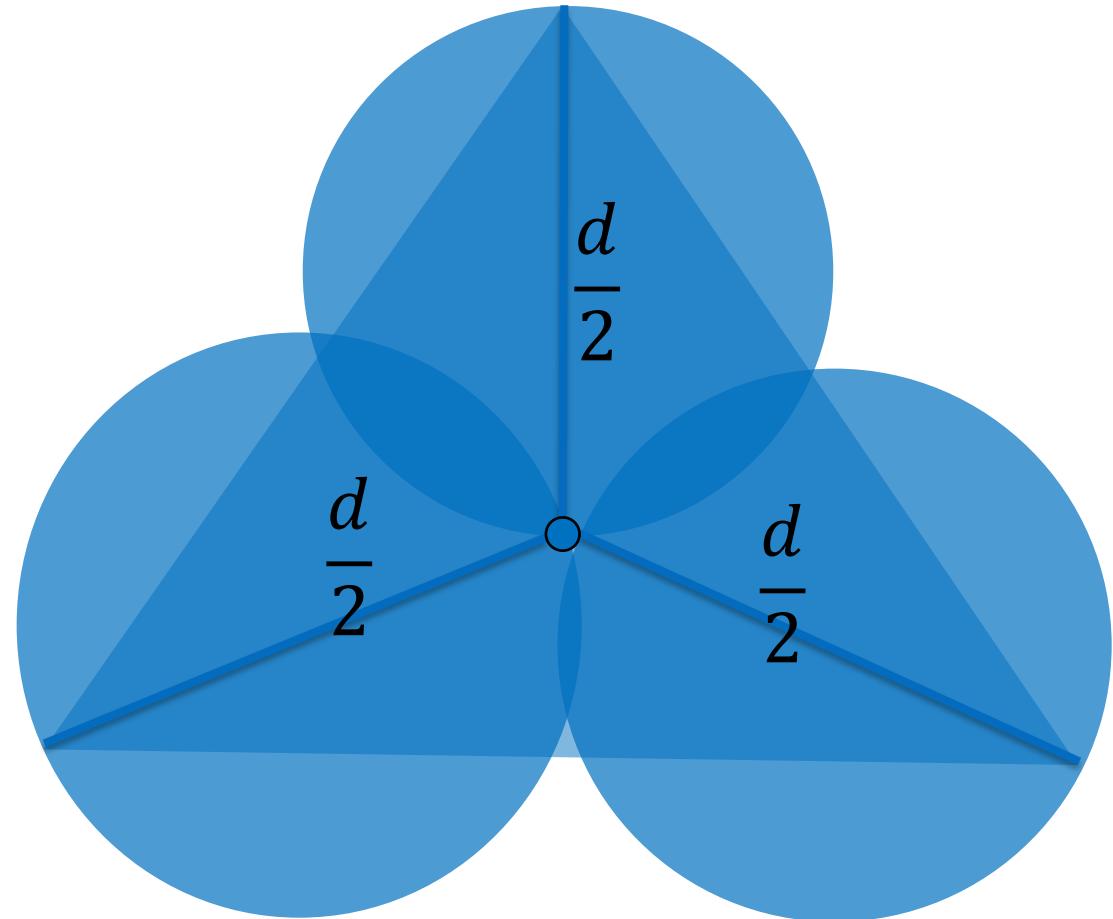
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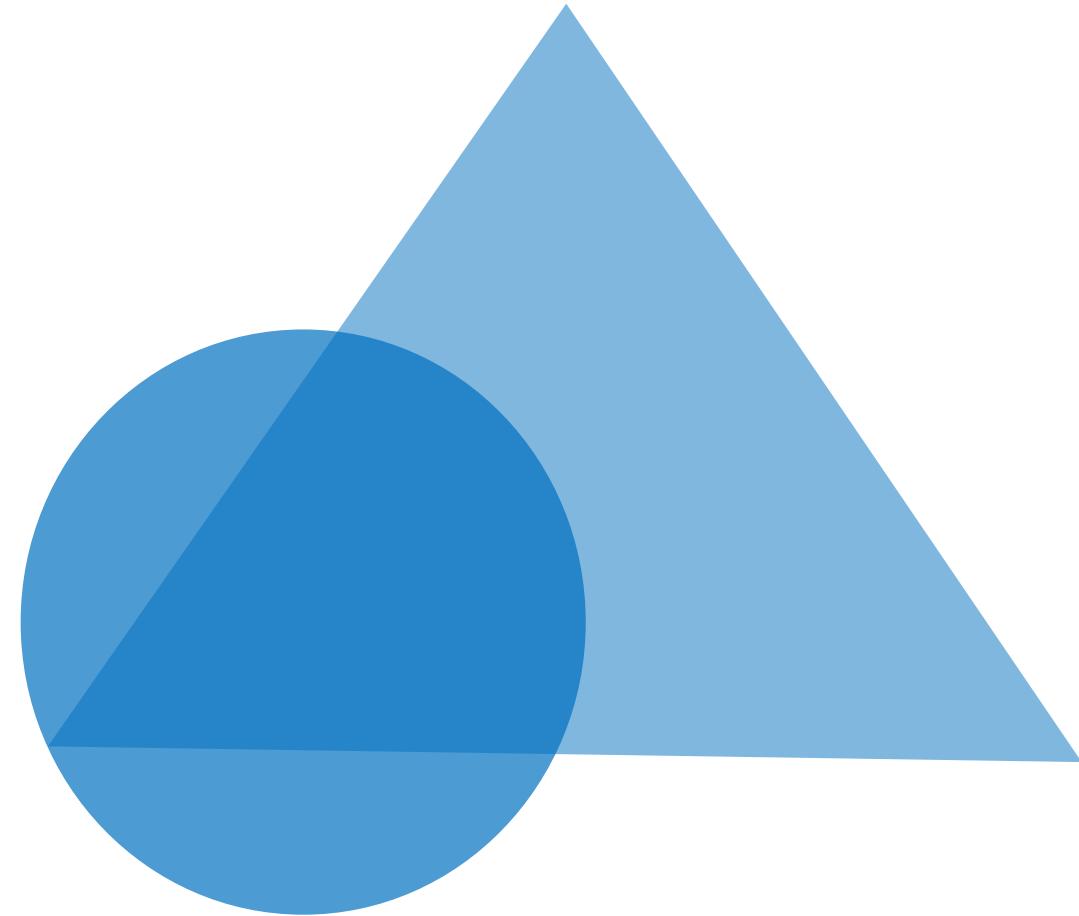
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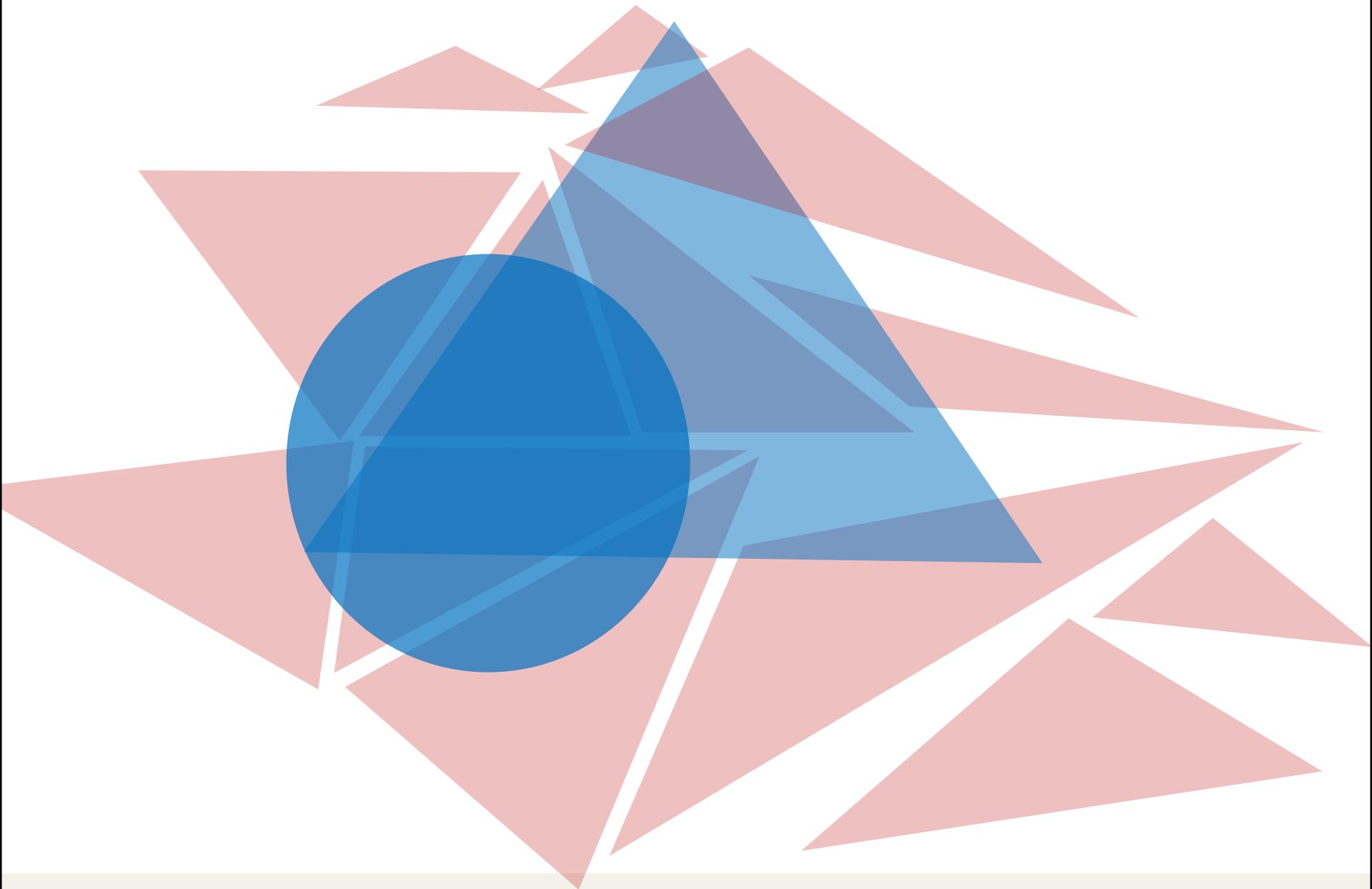
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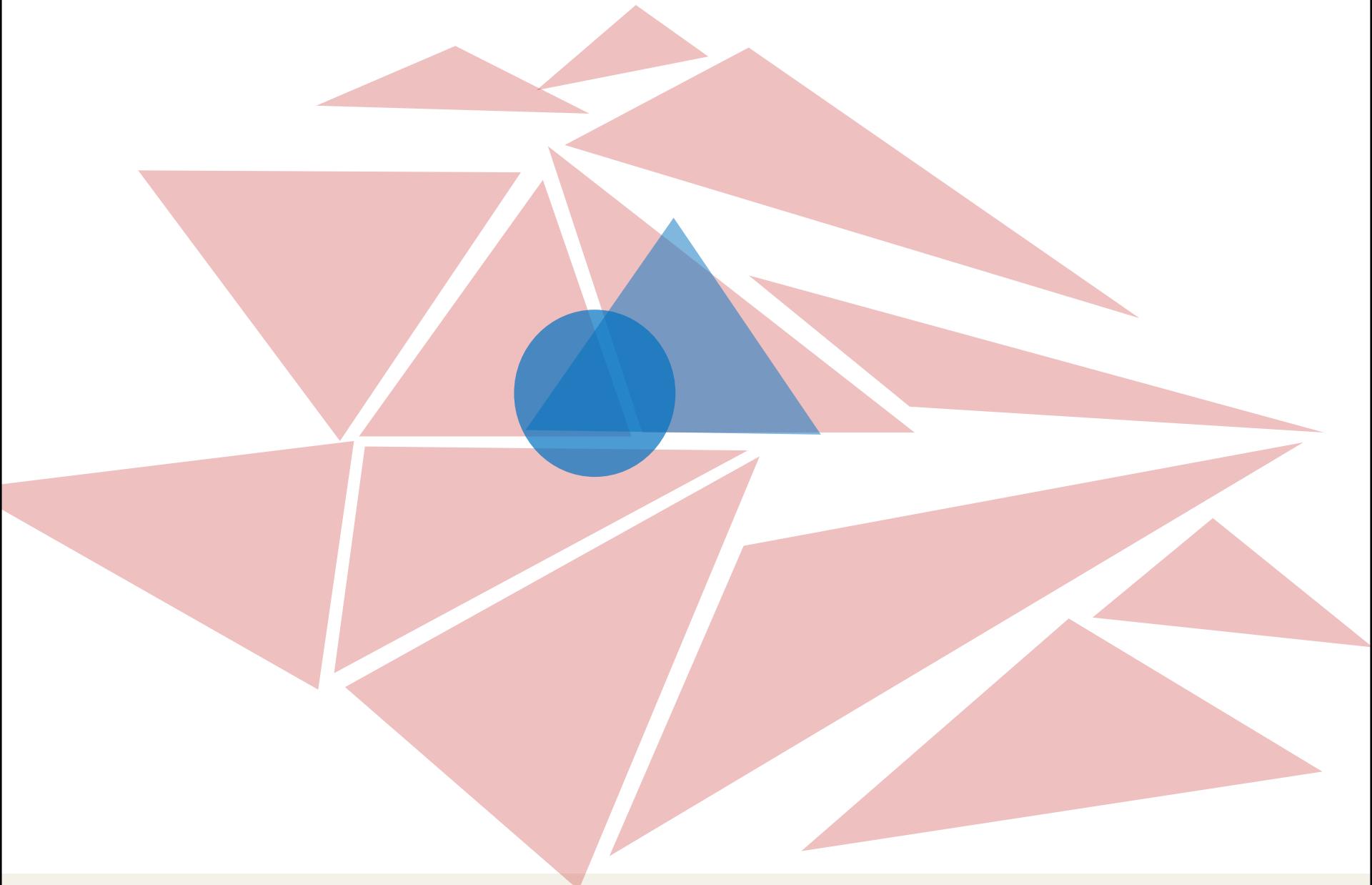
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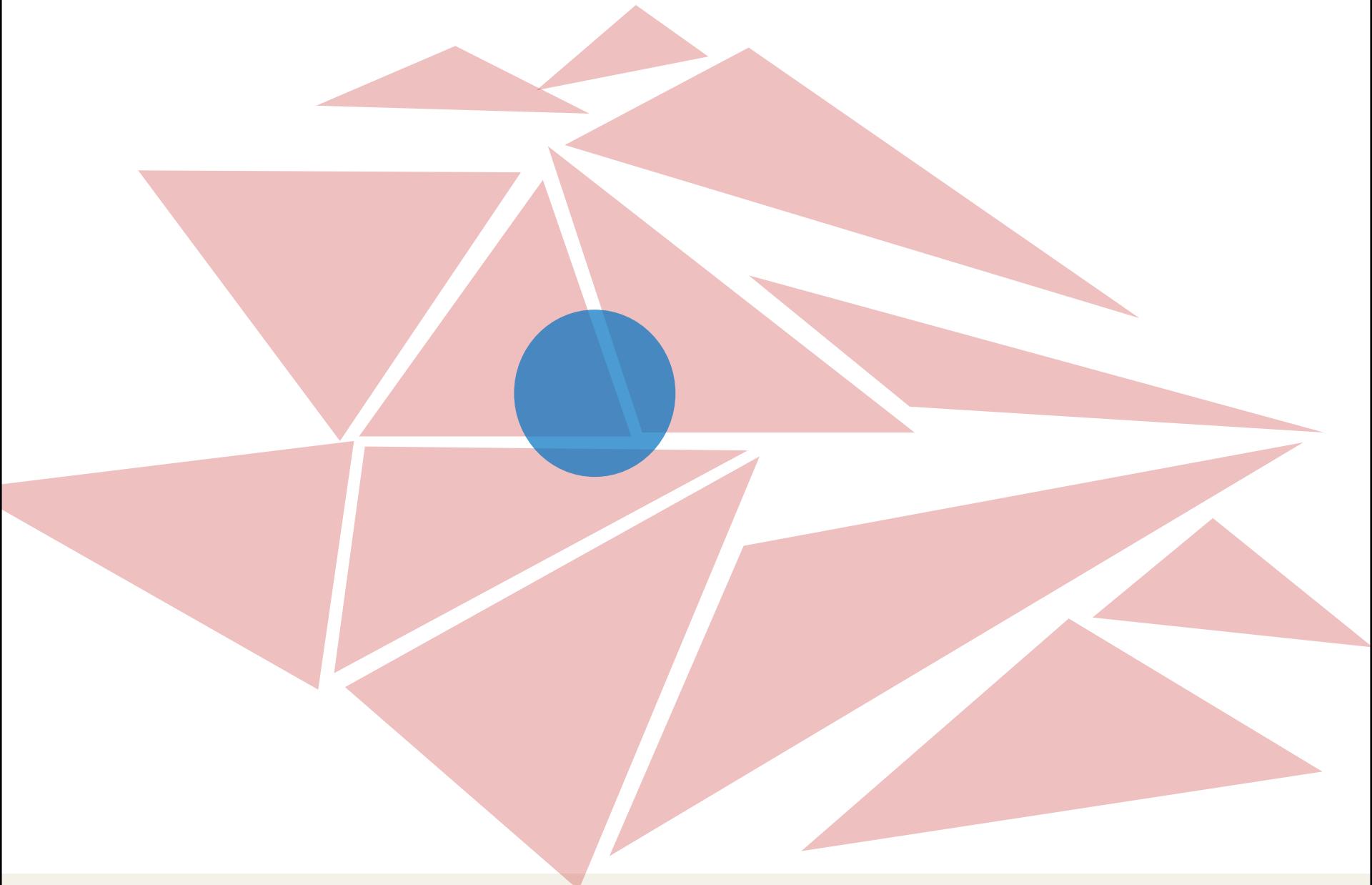
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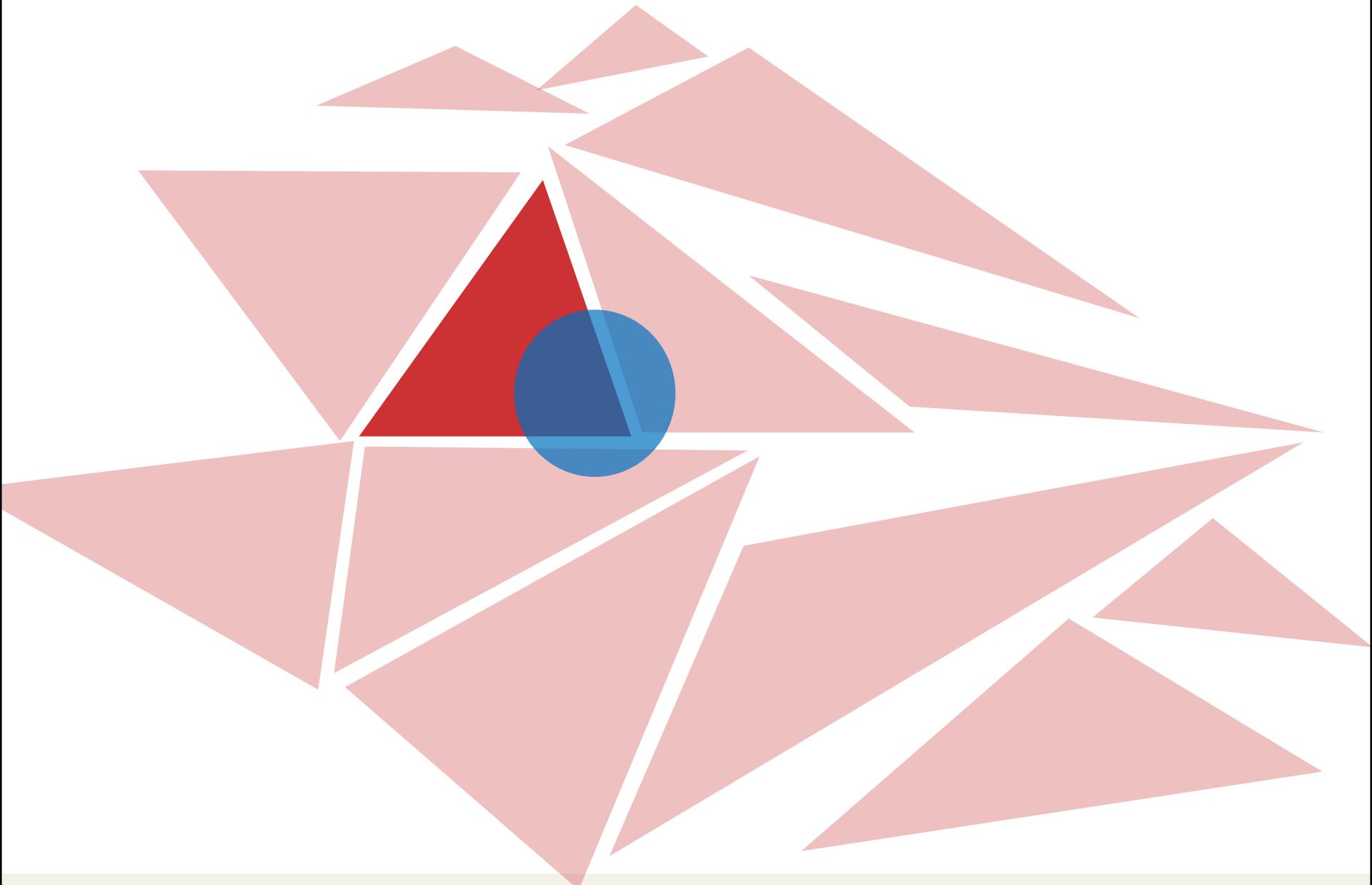
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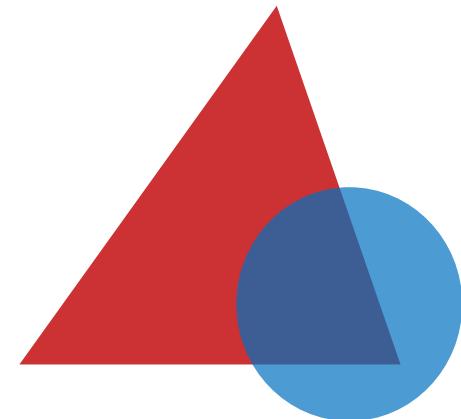
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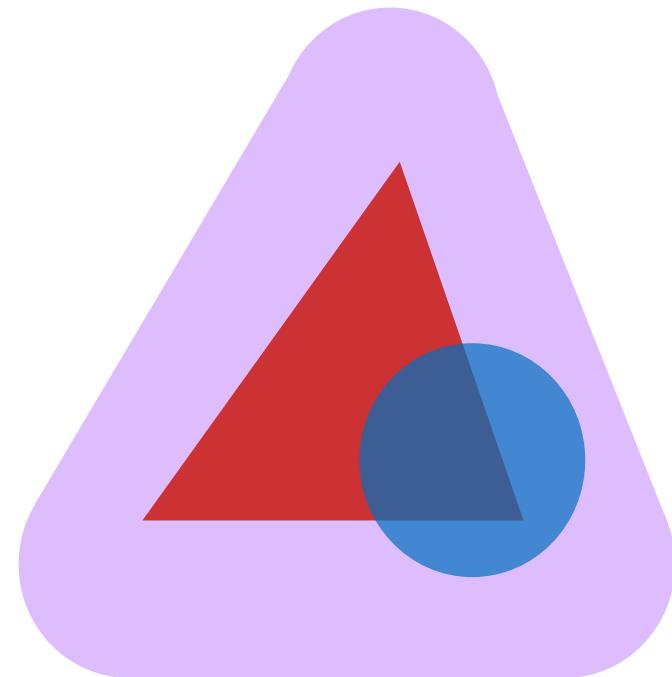
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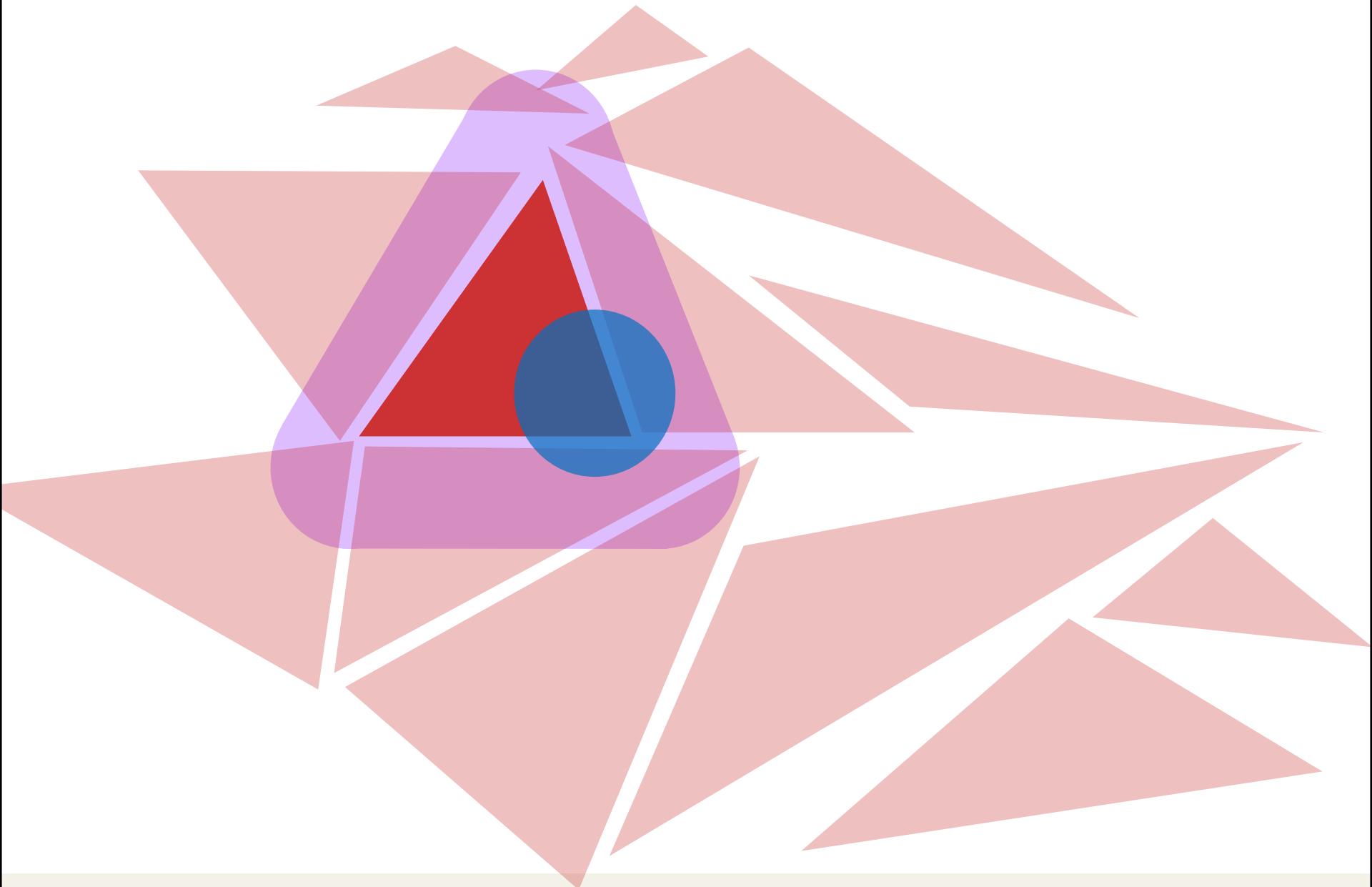
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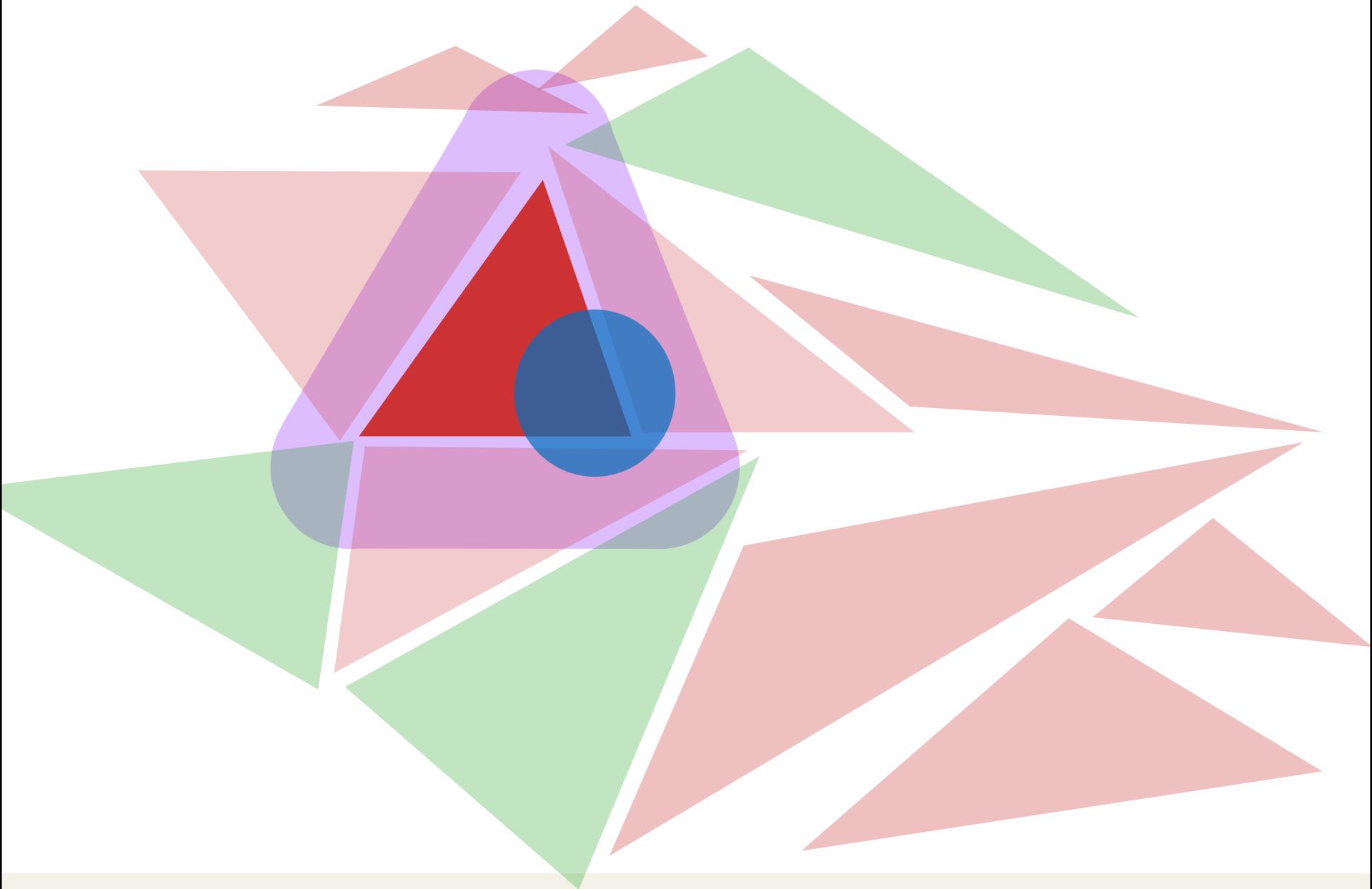
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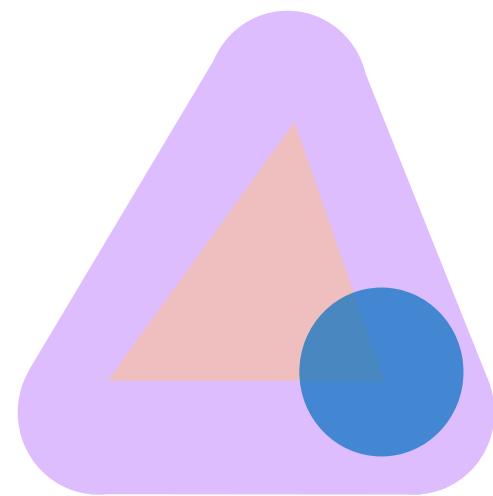
# Our Geometric Predicate



# Lemma

- Let  $A$  be a  $k$ -free set of triangles and let  $t \notin A$  be an arbitrary triangle that is not included in  $A$ . Then  $t$  intersects at most a constant number of larger triangles  $t_j \in A$ .

More precisely, the number of intersections between  $t$  and larger triangles  $t_j \in A$  is at most  $3k$ .



# Theorem

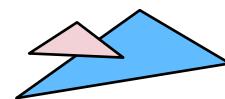
- Let  $A$  and  $B$  be two  $k$ -free sets of triangles. Then the total number of colliding triangles of  $A$  and  $B$  is in  $O(n)$ , where  $n$  is the number of triangles in  $A$  and  $B$ . More precisely, the number of intersections is at most  $3nk$ .

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- Proof:

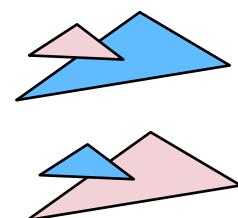
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- Proof:
  - Test small triangles  $t_i \in A$  against larger triangles in  $B$



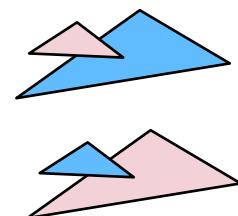
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- $\Rightarrow \leq 3k$  intersections for each  $t_i \in A$  and  $t_j \in B$
- $\Rightarrow$  Total number of intersection  $\leq 3kn$
- $\Rightarrow O(n)$  intersections

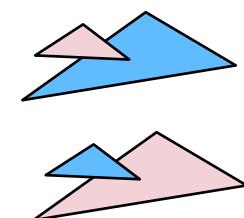


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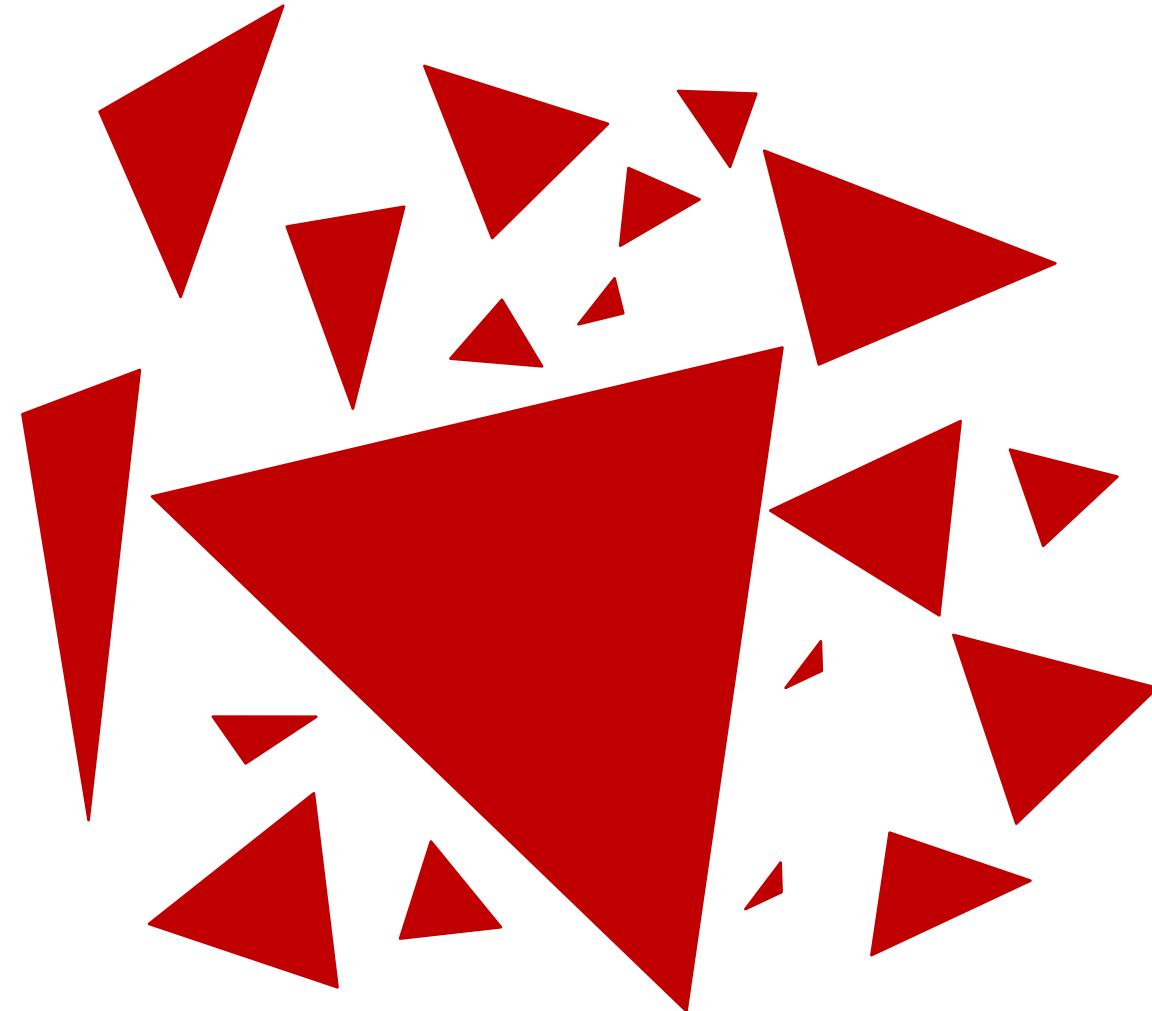
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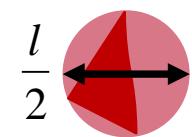
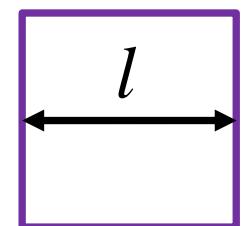
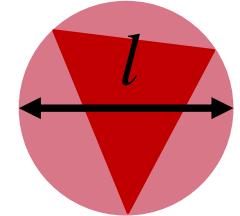
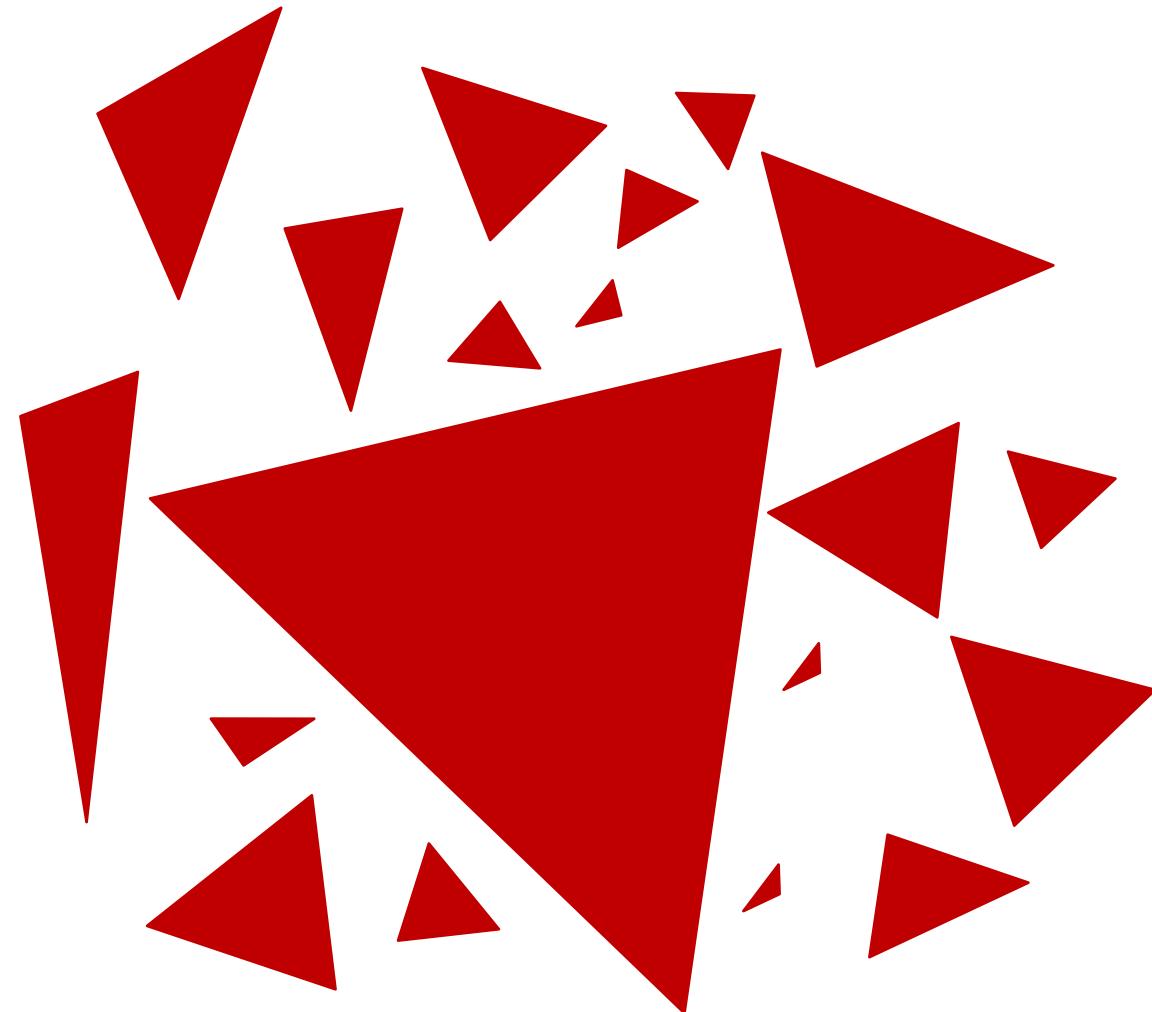
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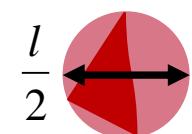
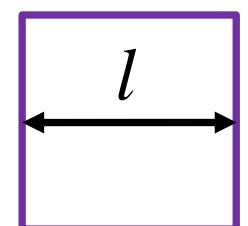
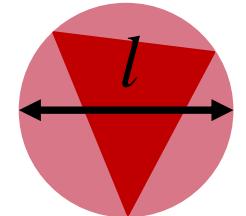
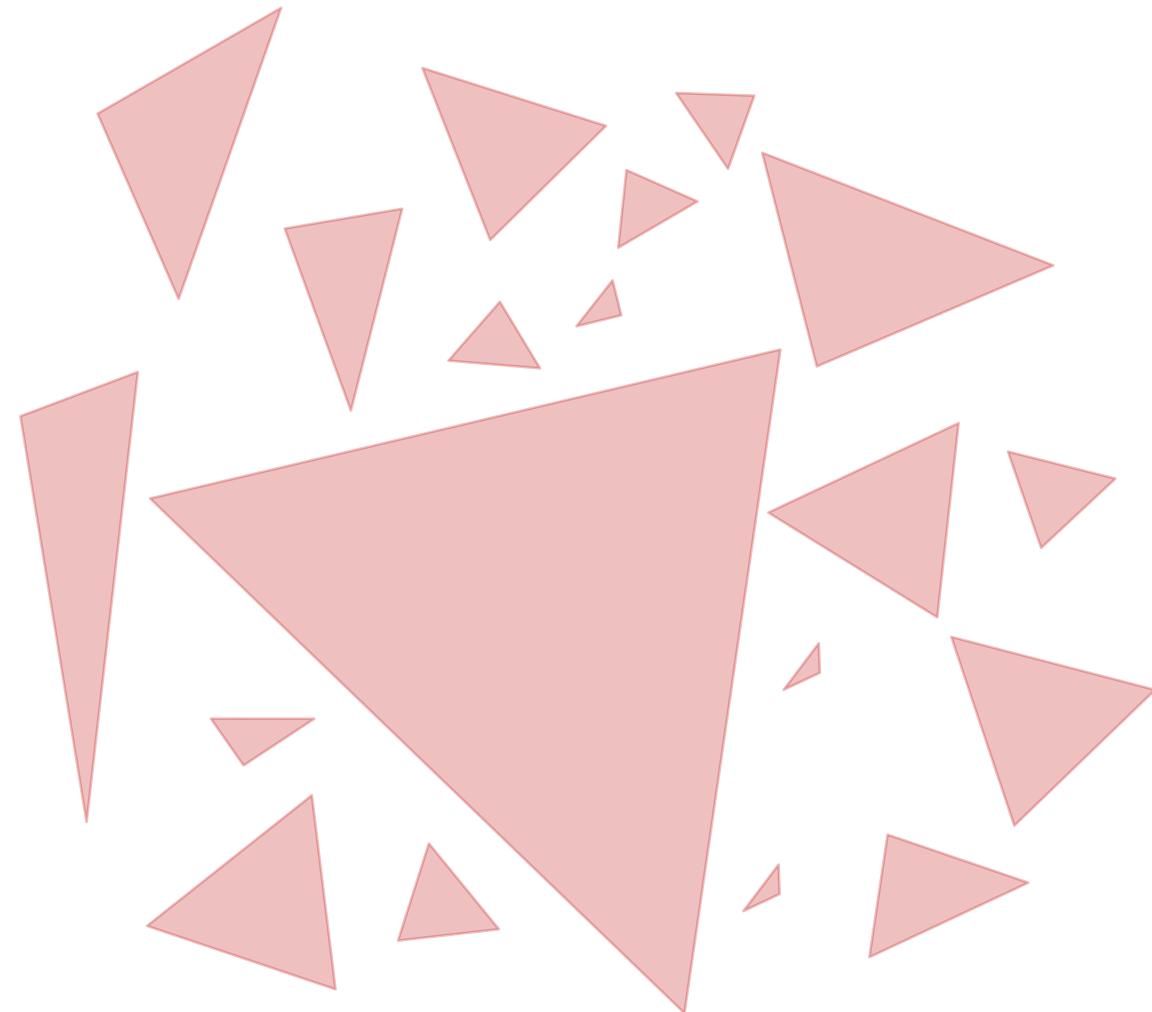
# Our Algorithm



# Our Algorithm



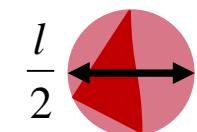
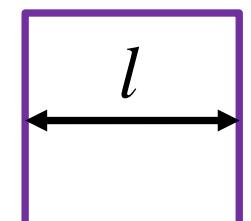
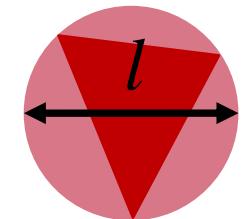
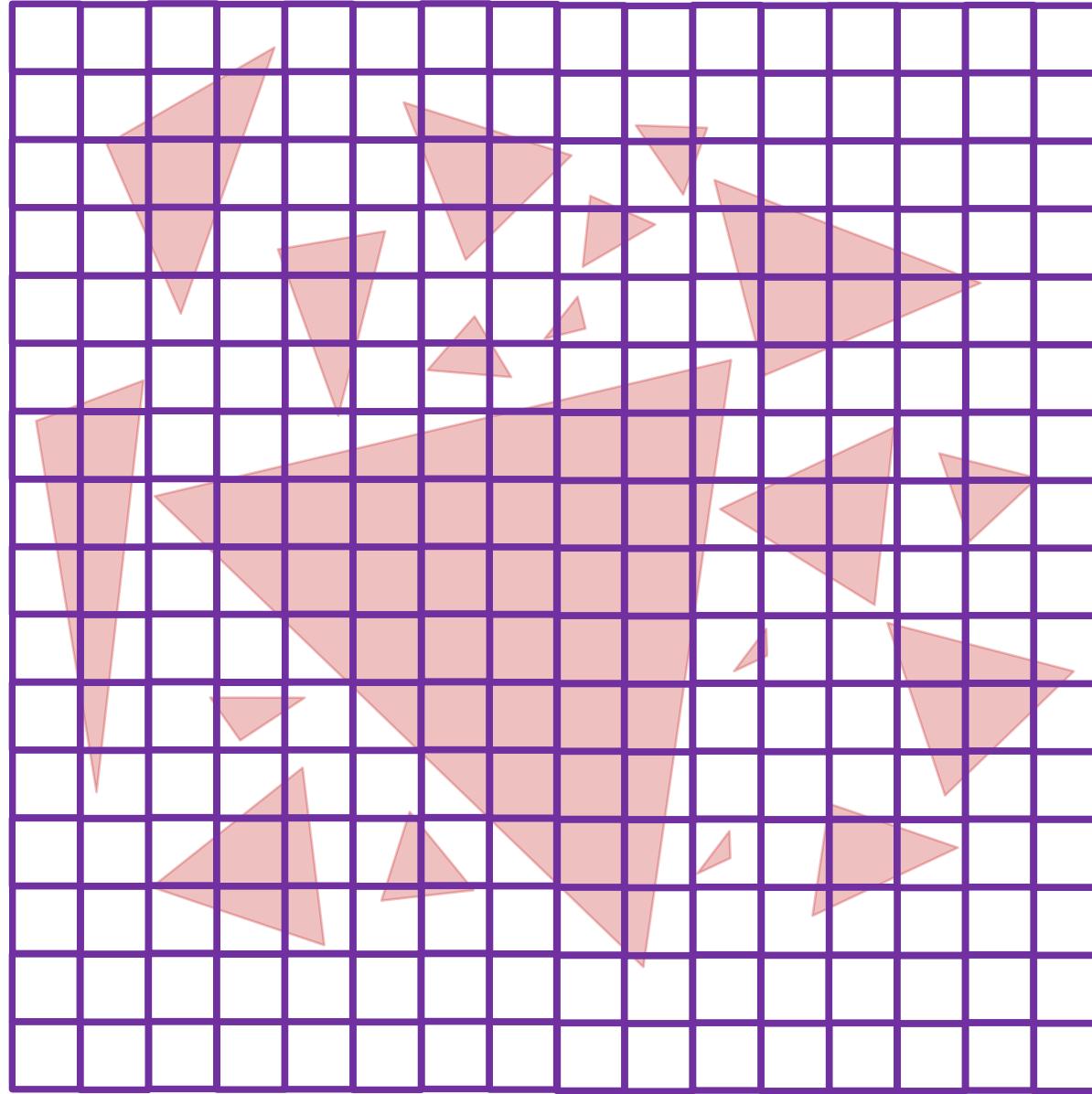
# Our Algorithm



# Our Algorithm

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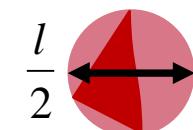
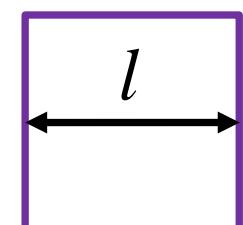
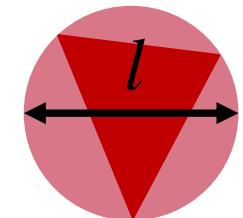
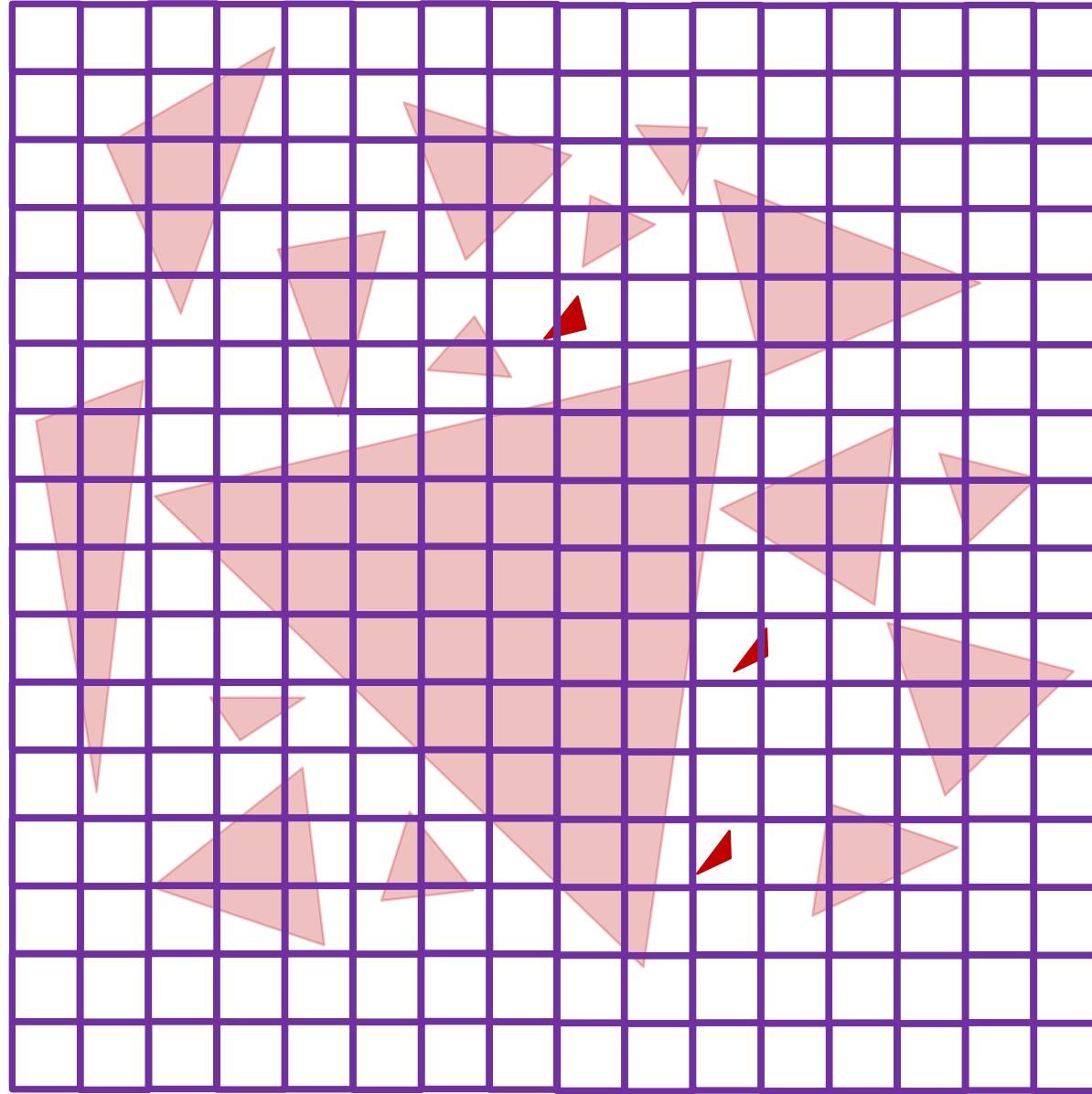
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# Our Algorithm

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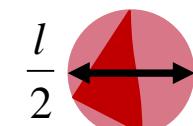
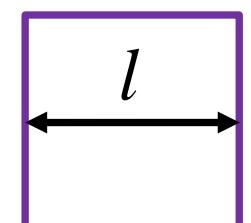
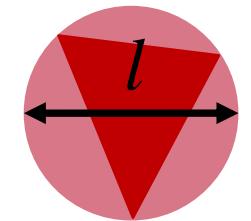
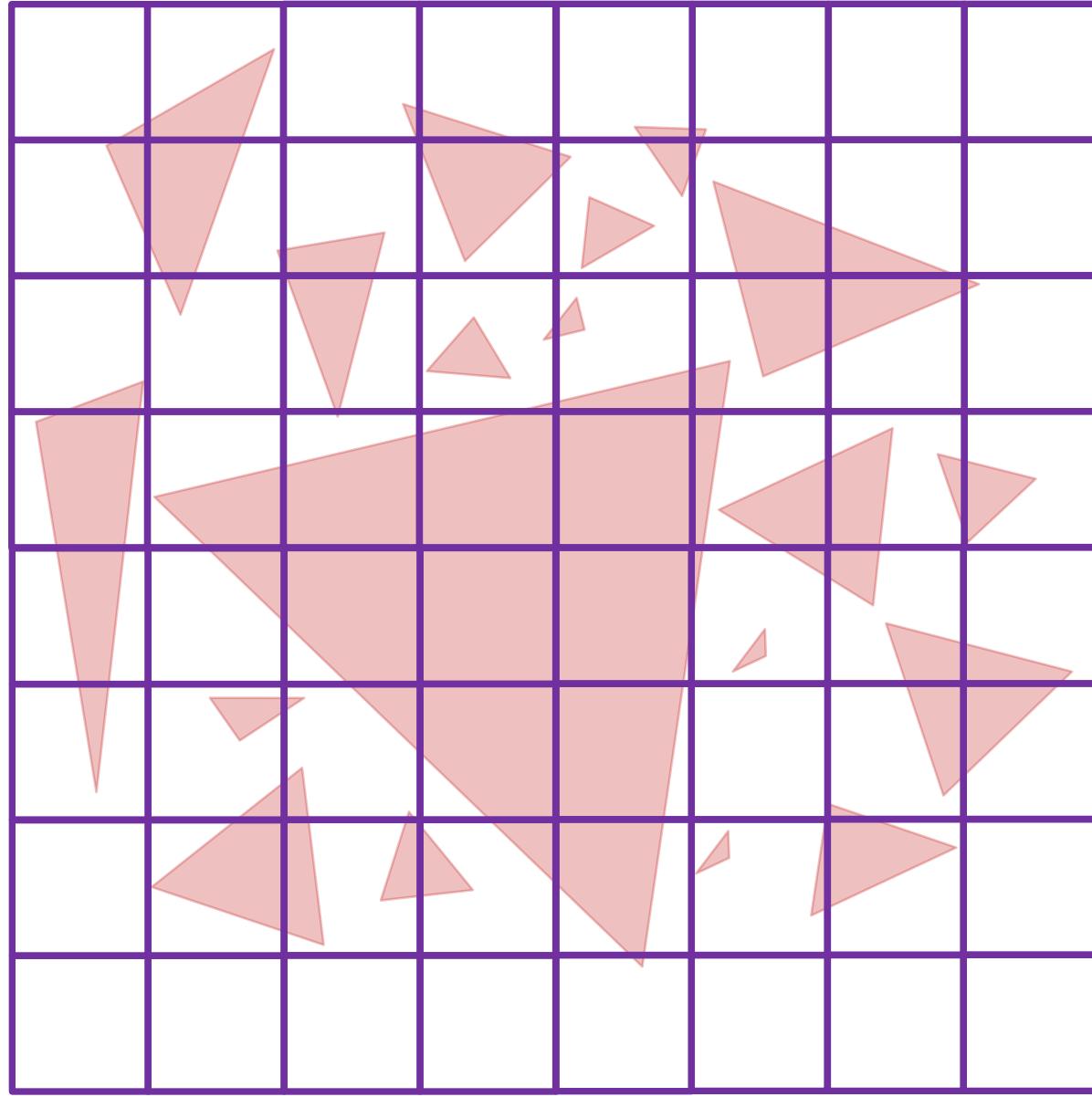
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# Our Algorithm

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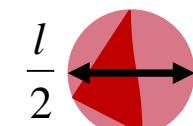
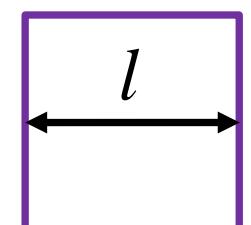
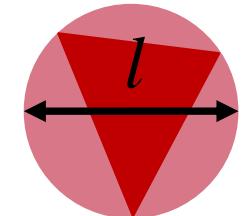
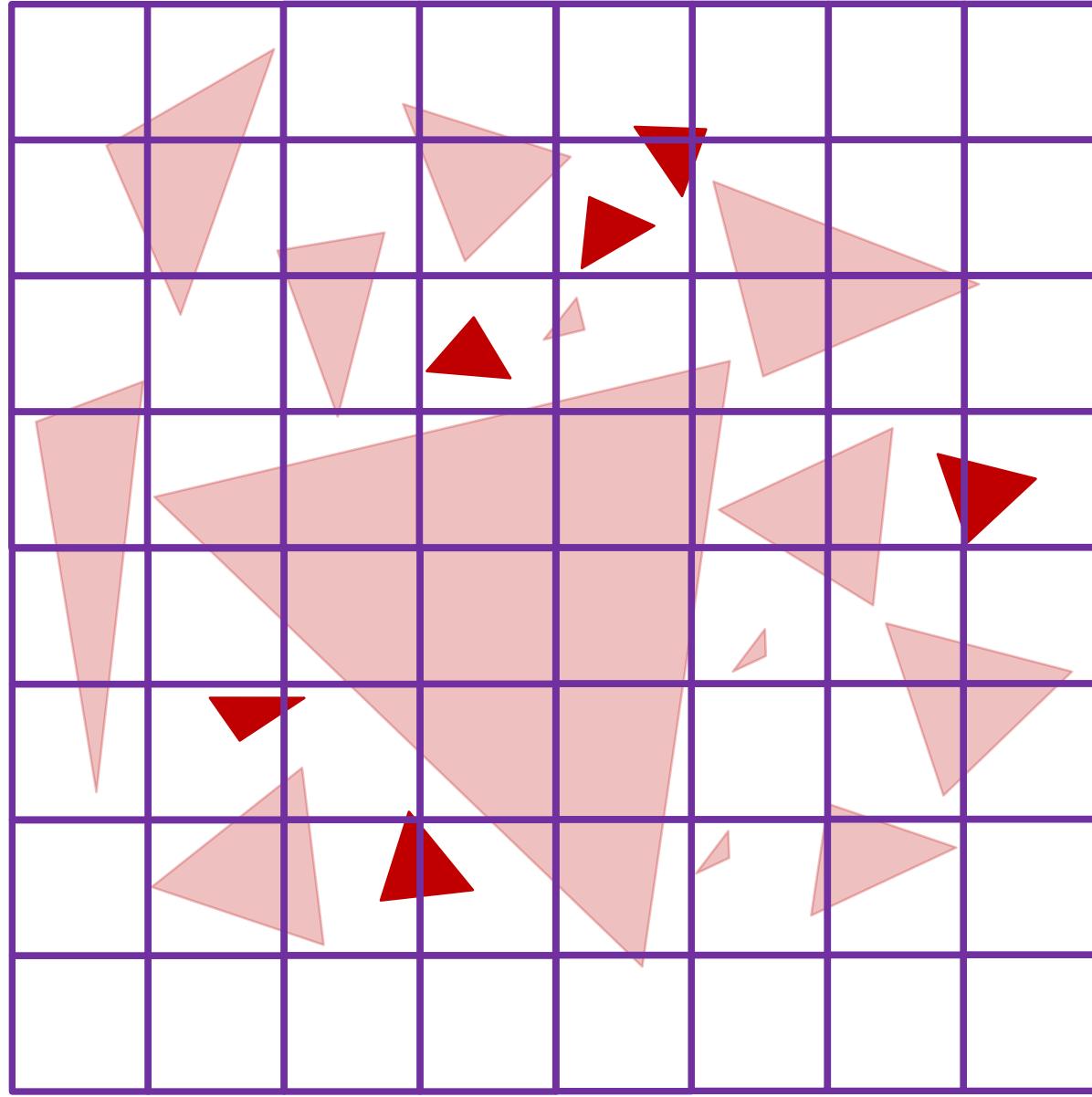
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# Our Algorithm

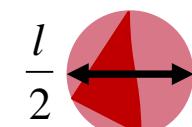
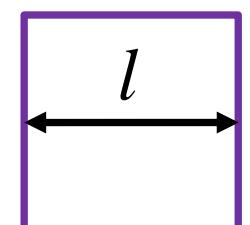
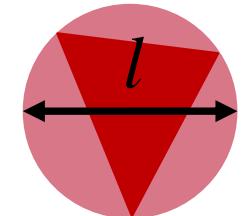
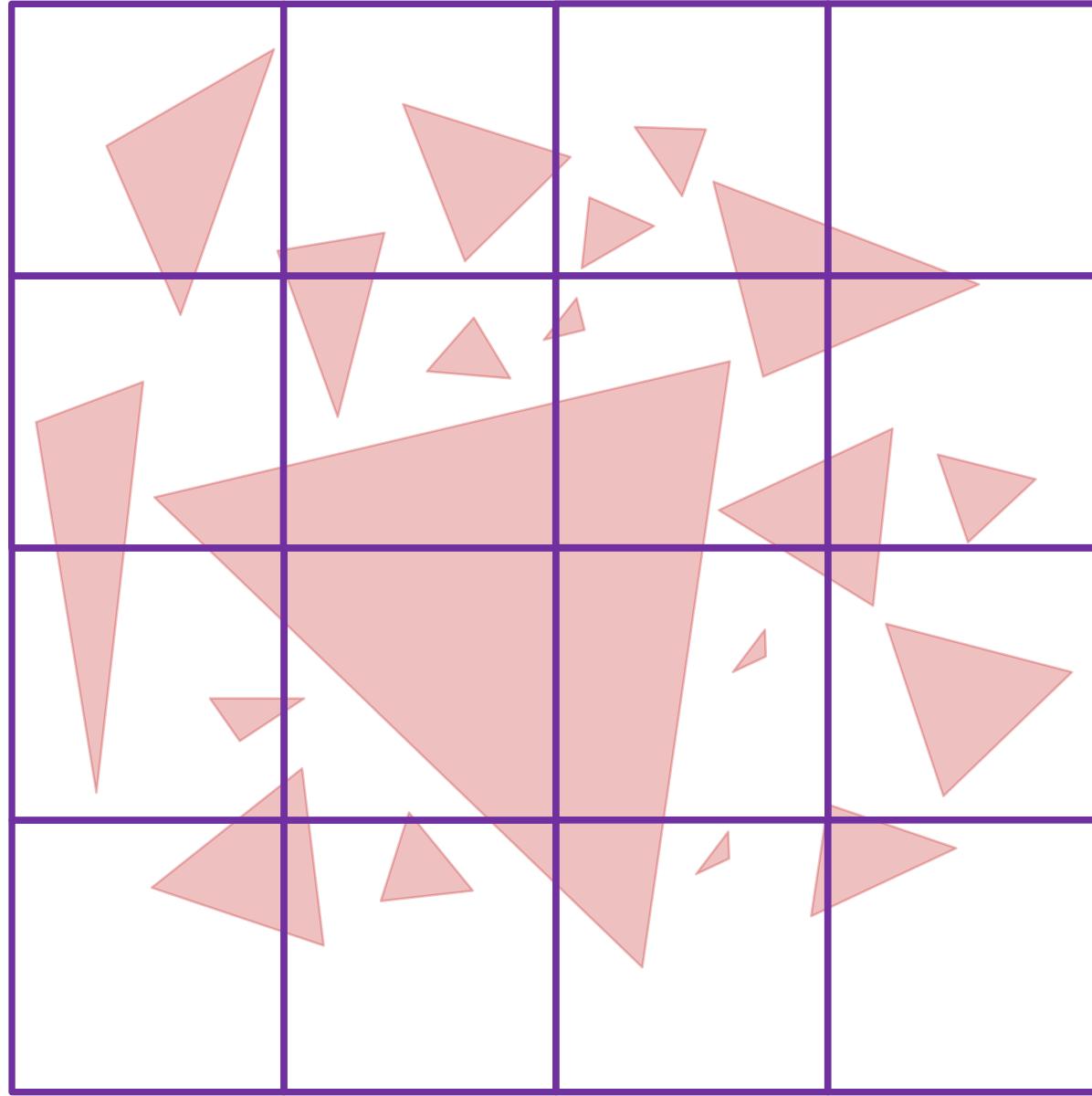
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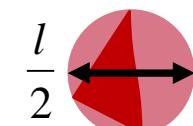
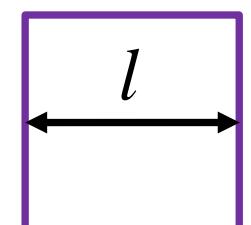
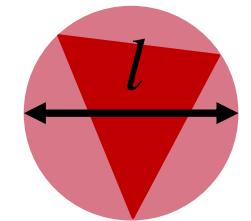
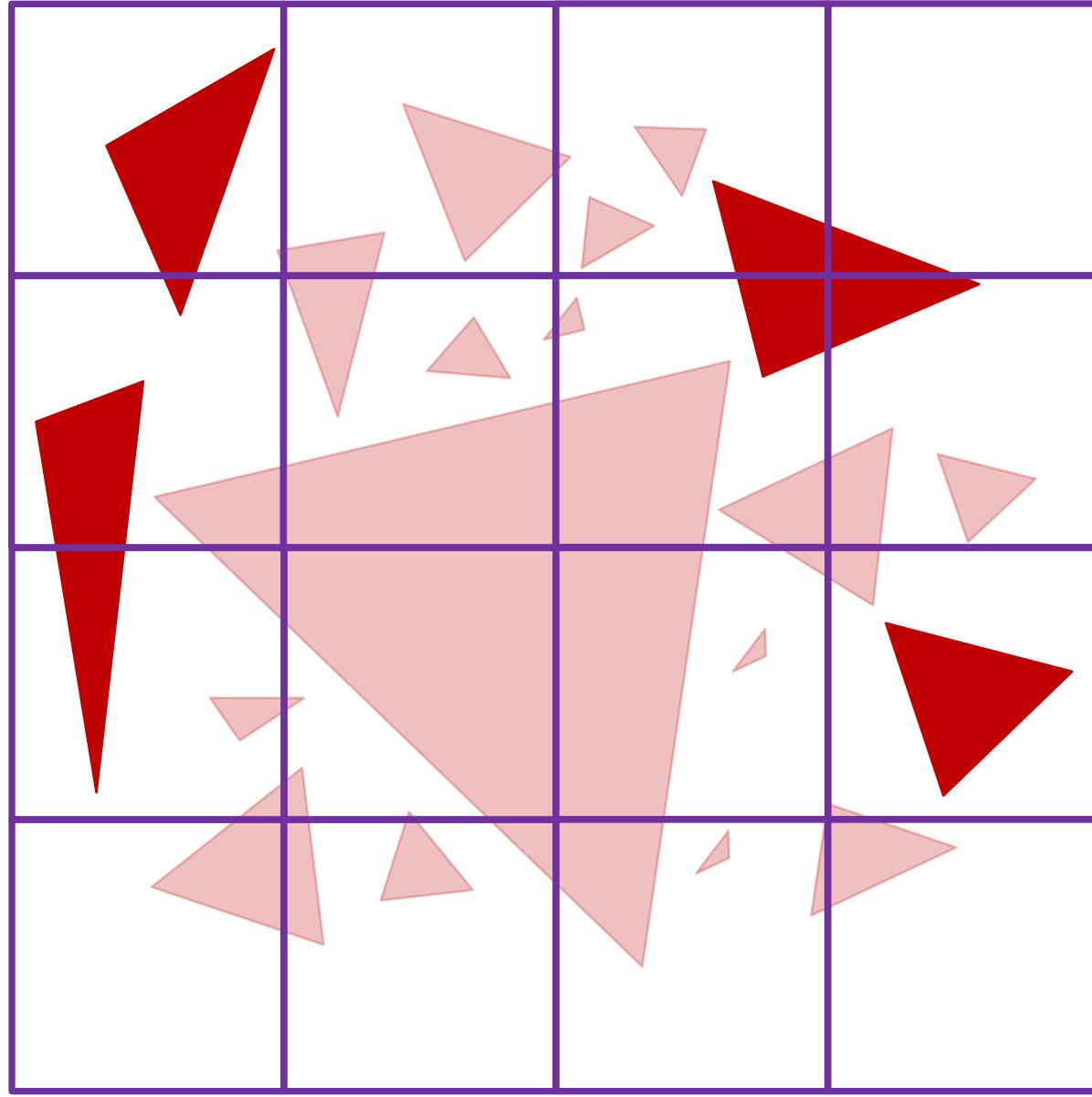
# Our Algorithm

Level 2



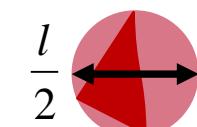
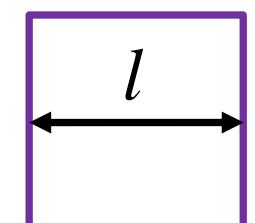
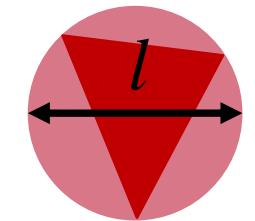
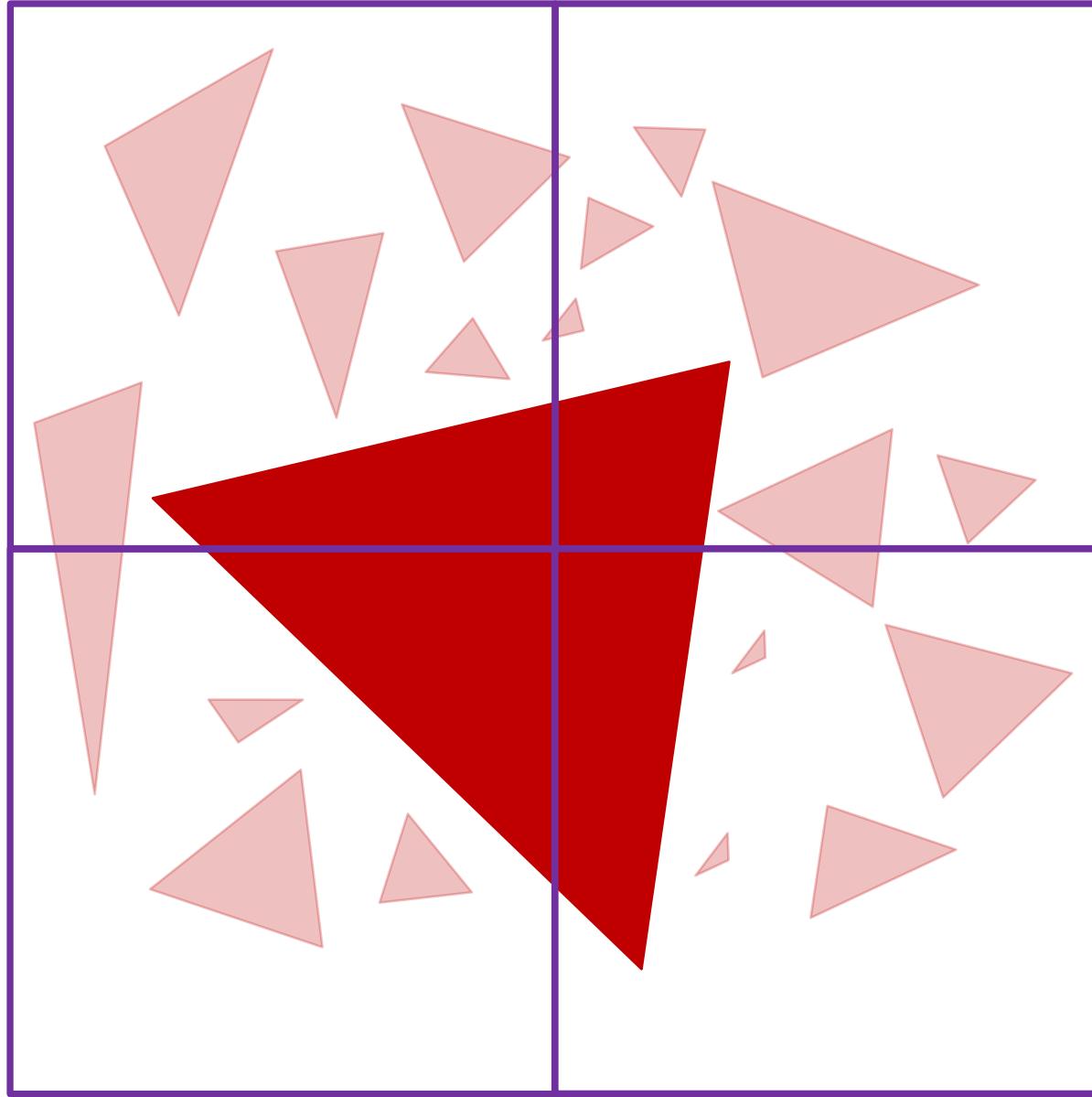
# Our Algorithm

Level 2

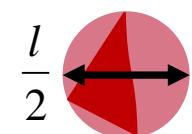
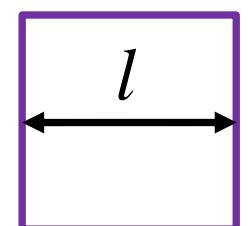
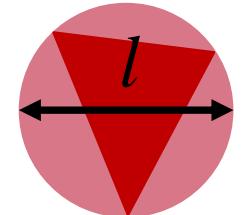
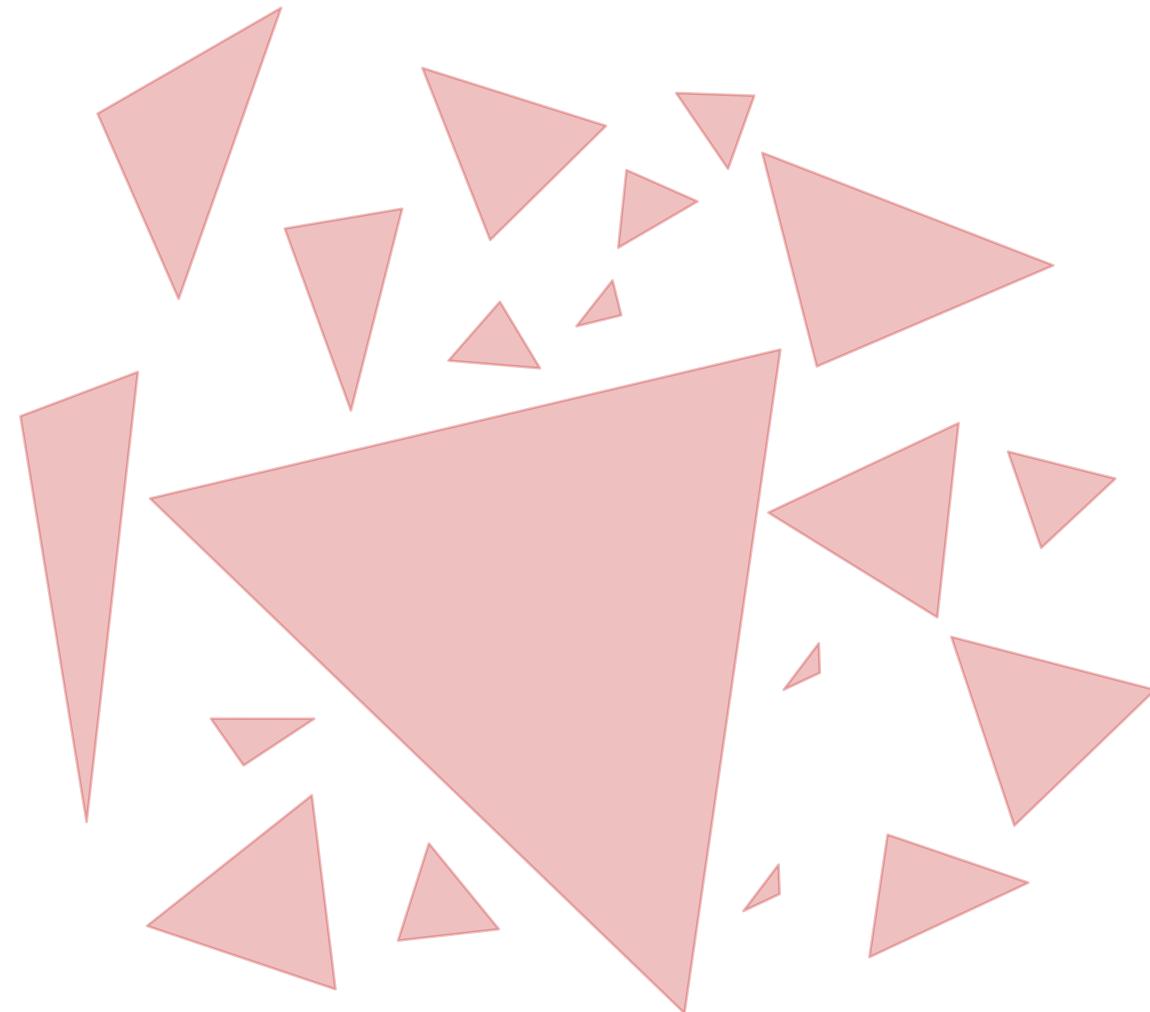


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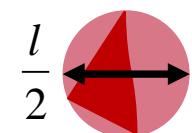
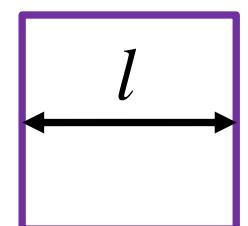
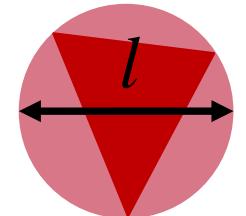
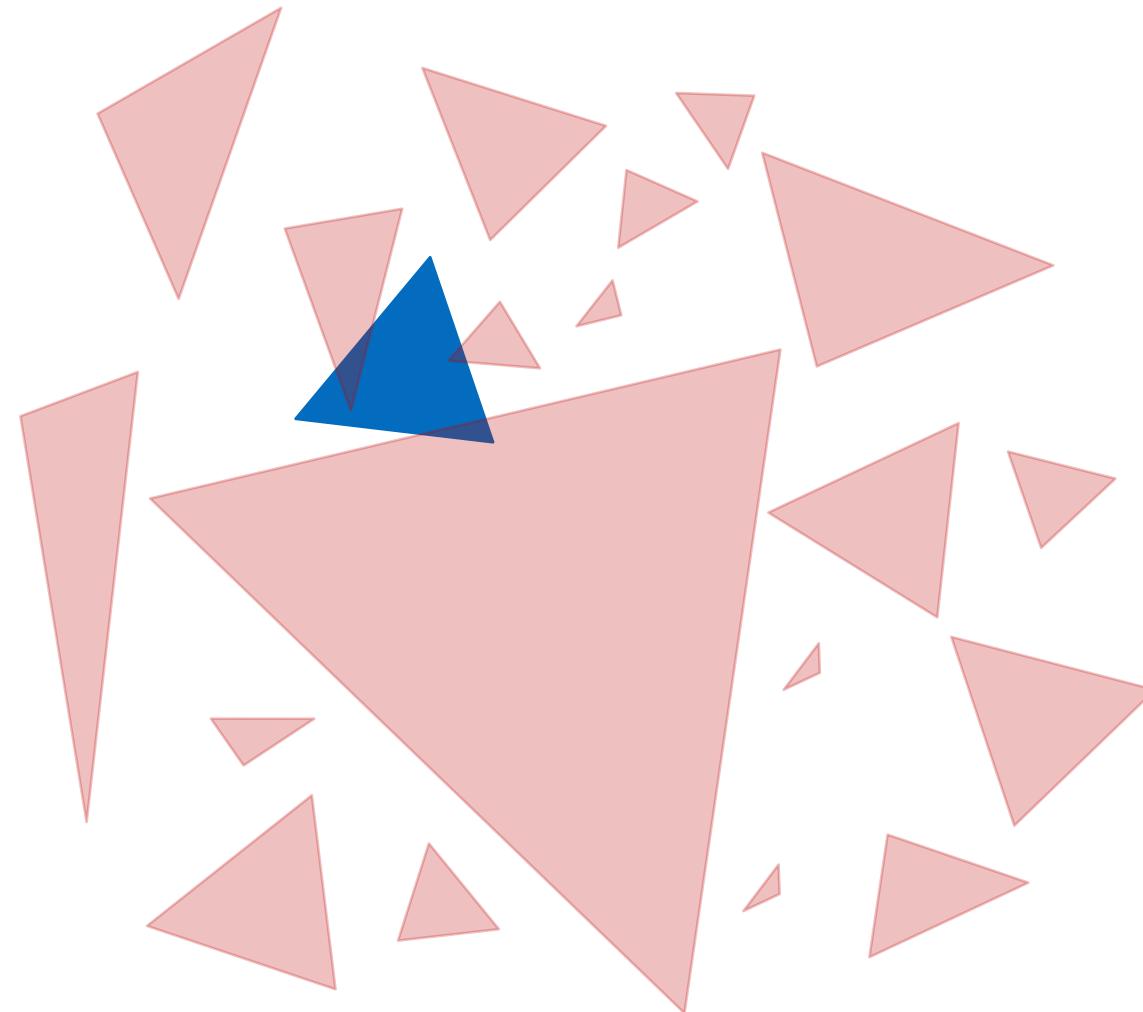
Level 1



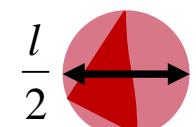
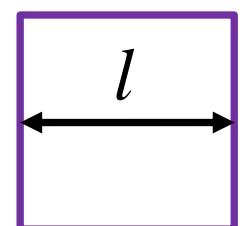
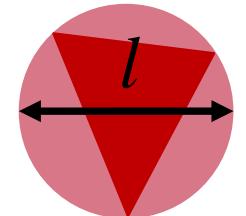
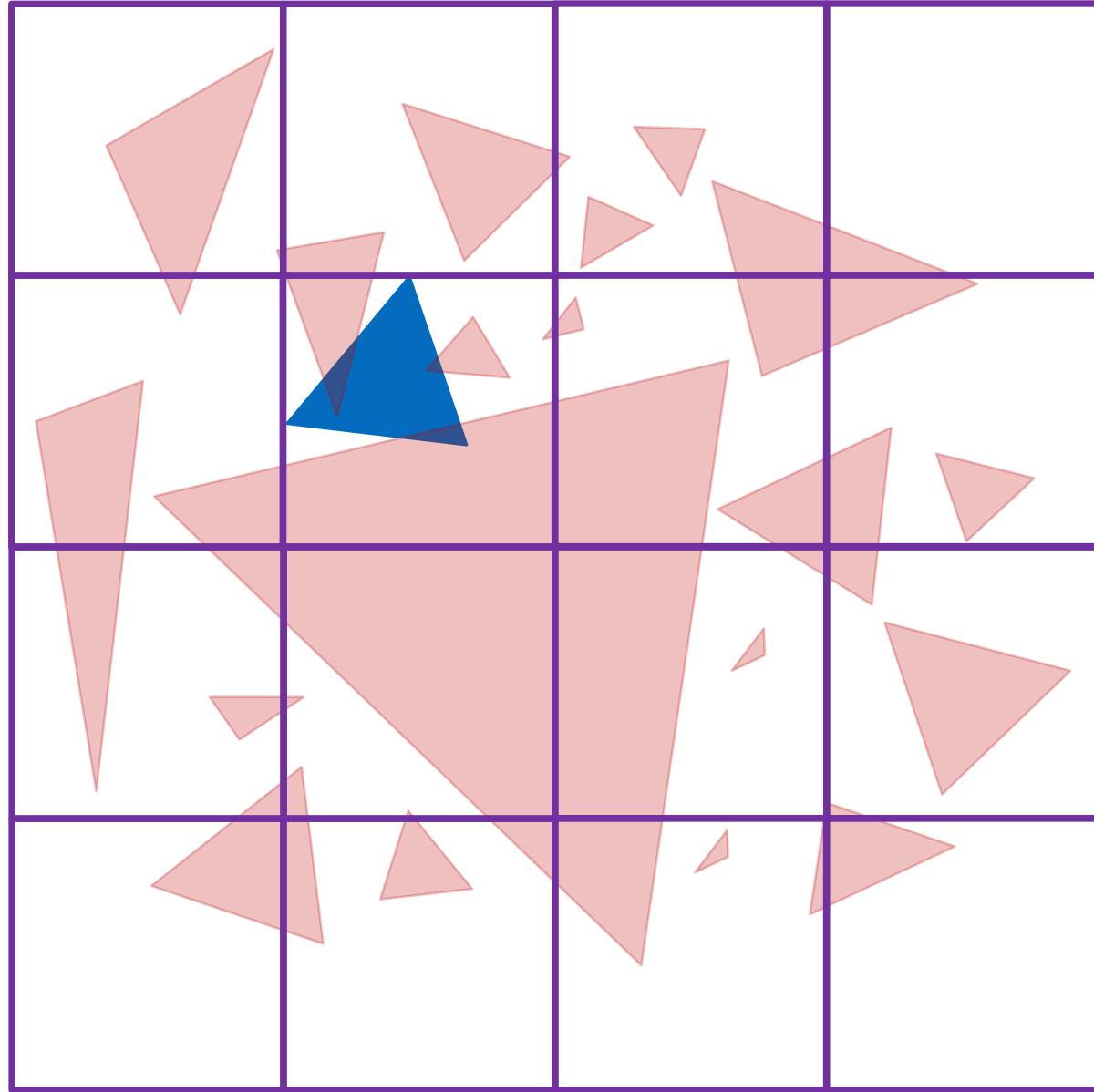
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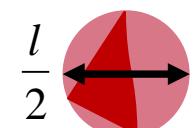
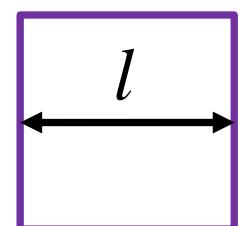
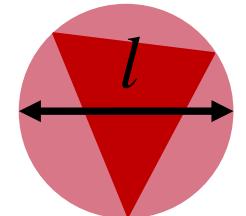
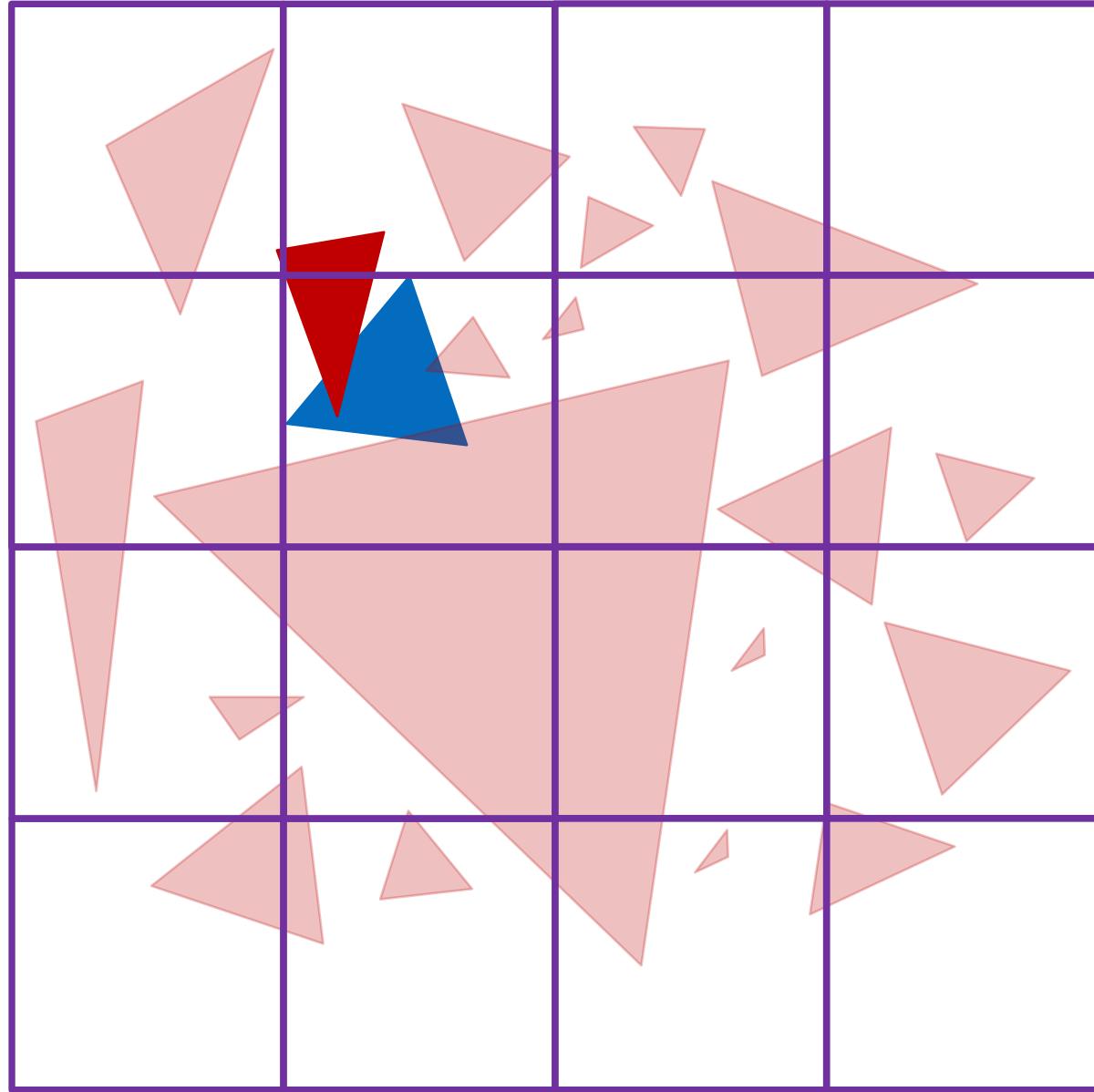
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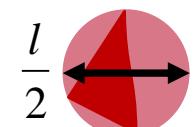
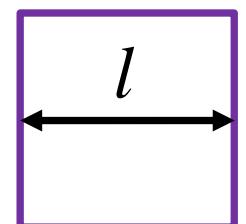
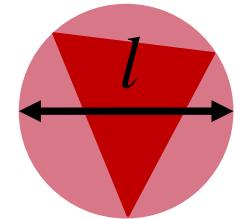
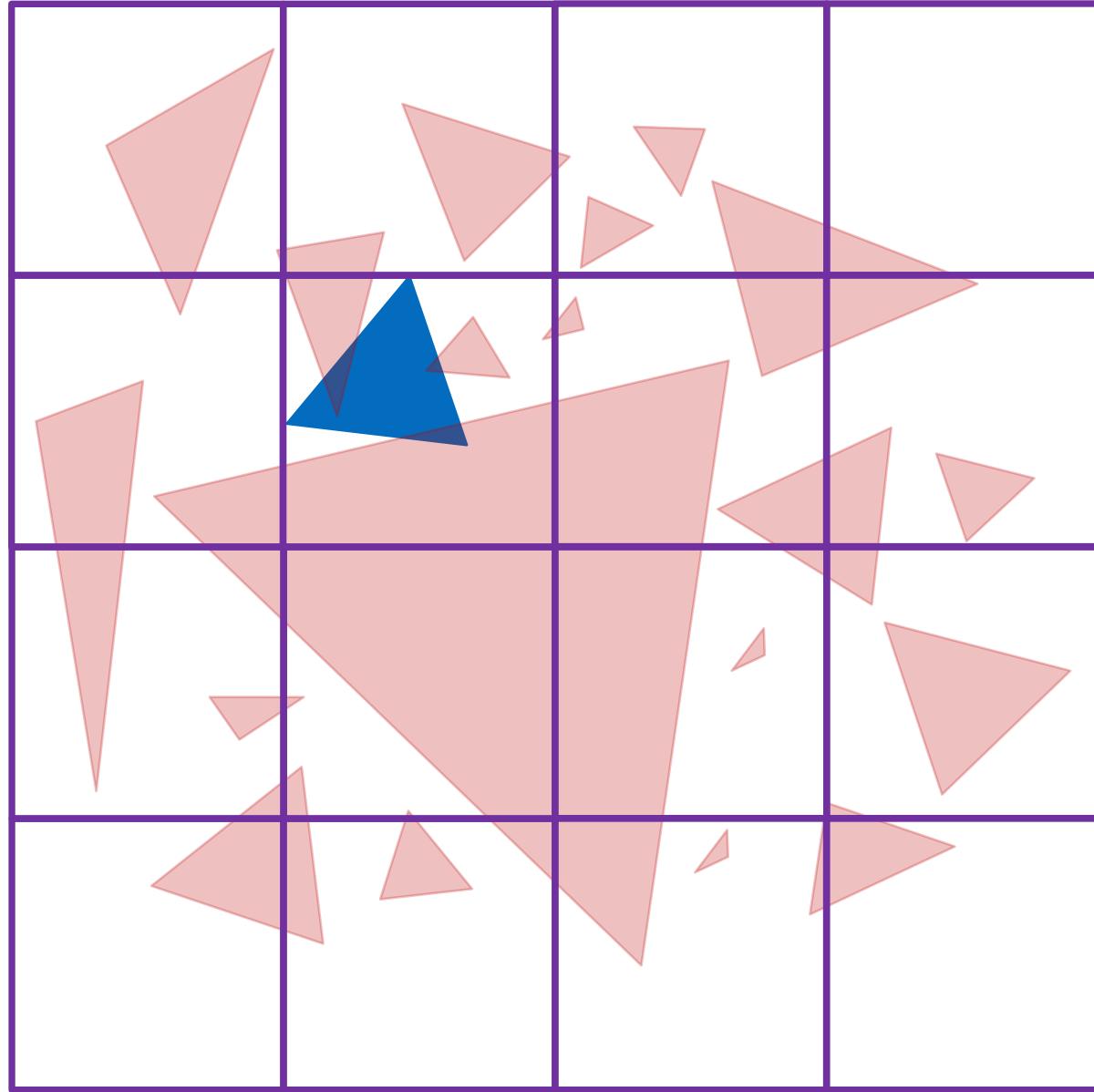
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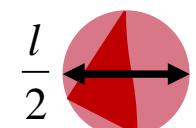
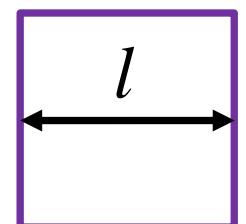
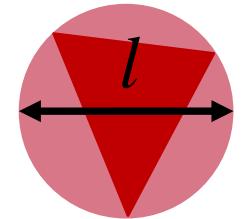
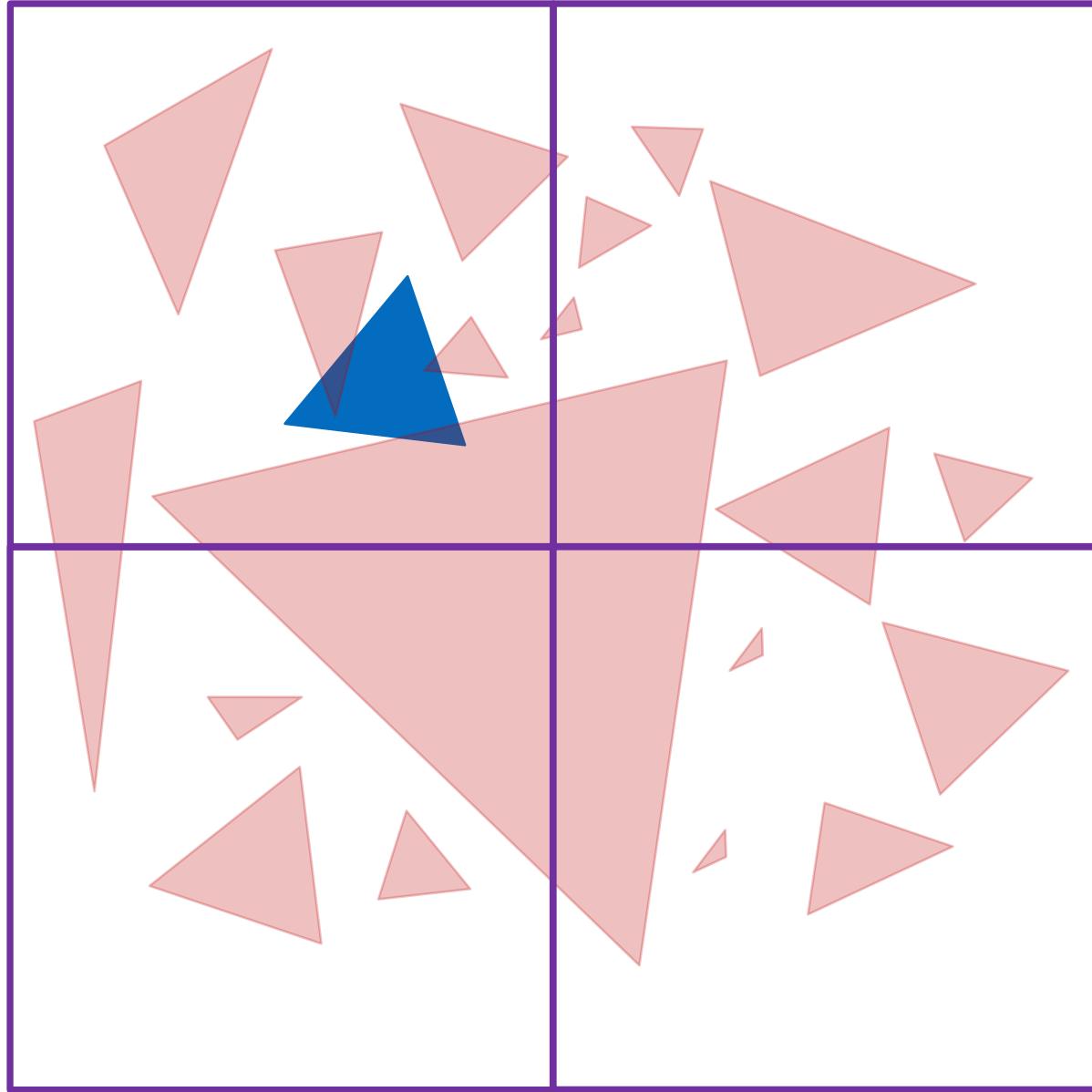
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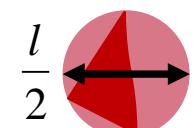
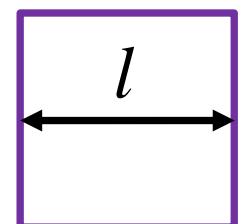
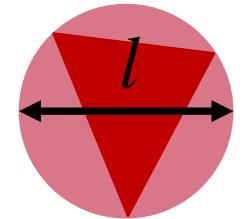
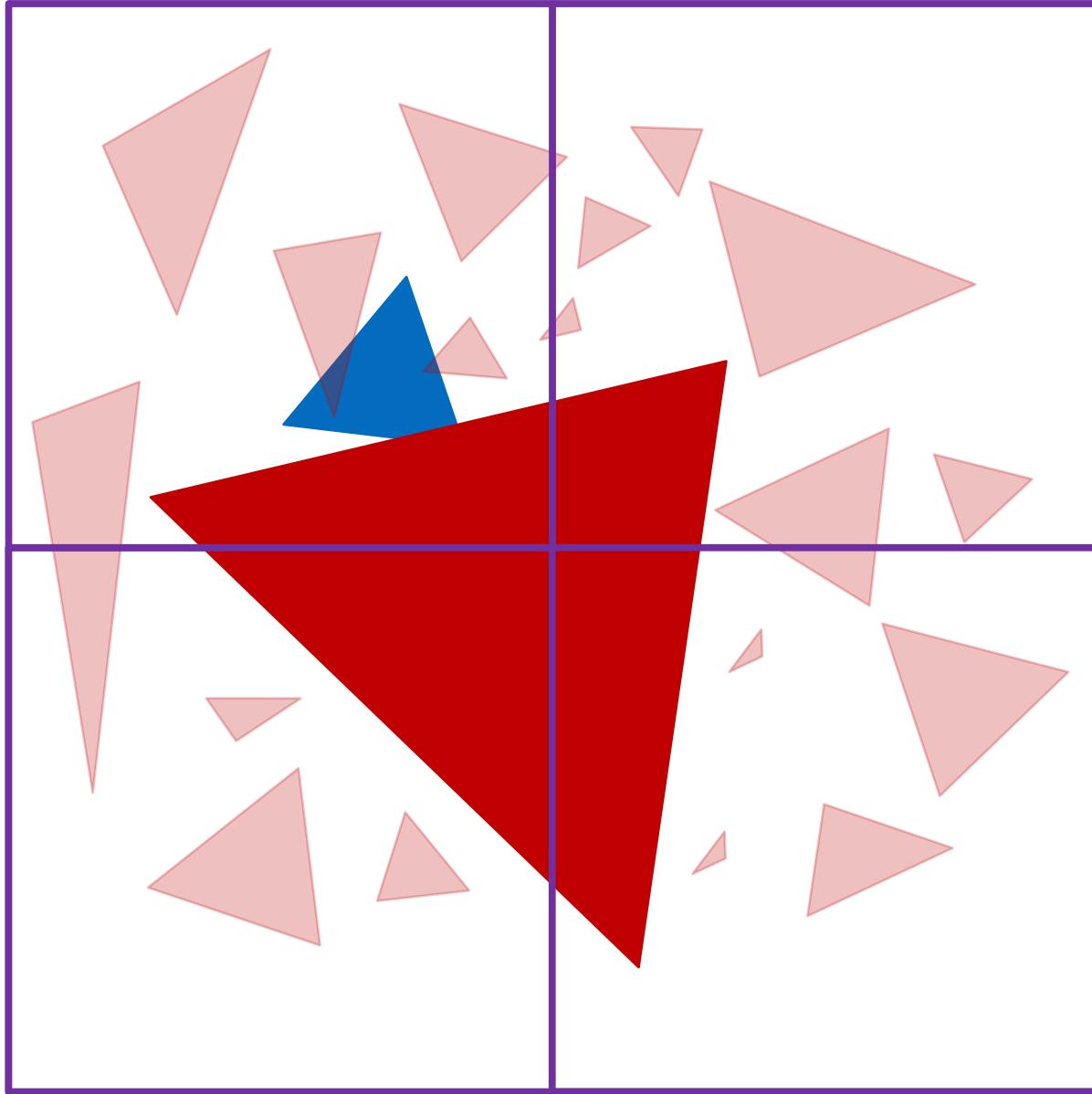
# Our Algorithm



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# Analysis



# Analysis

For each triangle  $t \in B$ :



# Analysis

For each triangle  $t \in B$ :

Compute hierarchy level l



# Analysis

For each triangle  $t \in B$ :

Compute hierarchy level  $l$

For all levels  $l_i, l \leq l_i \leq l_{\max}$ :



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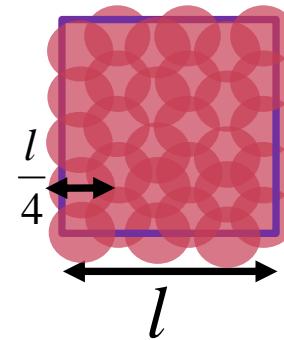
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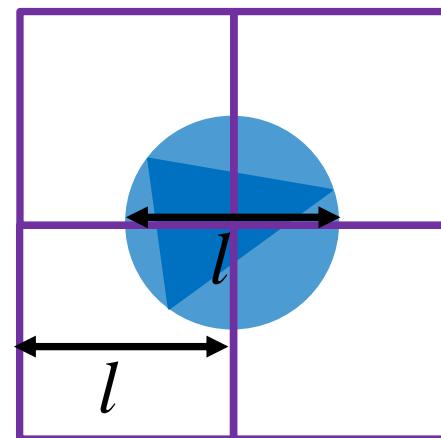
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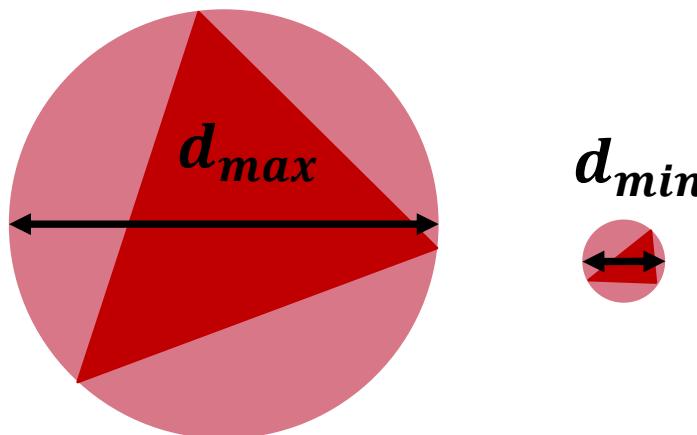
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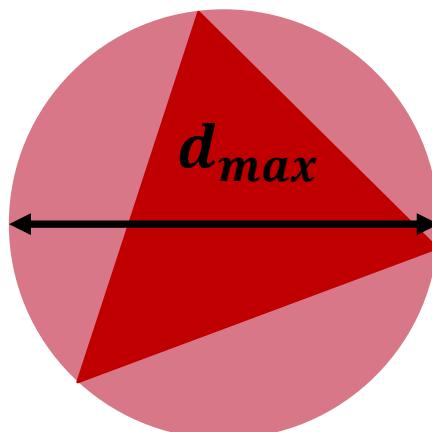
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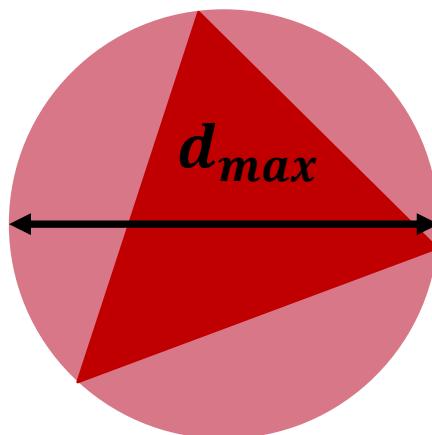
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# Analysis

In Parallel for all triangles  $t \in B$ :

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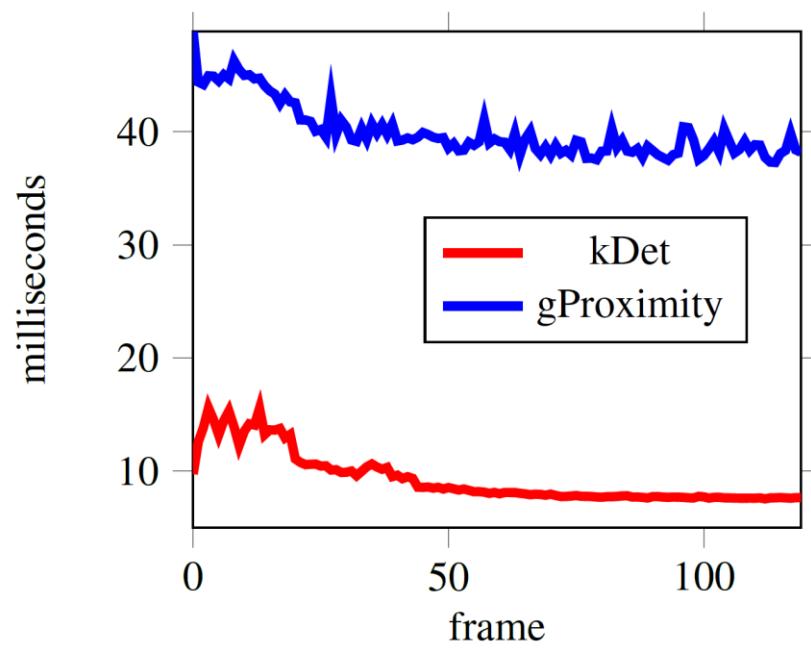
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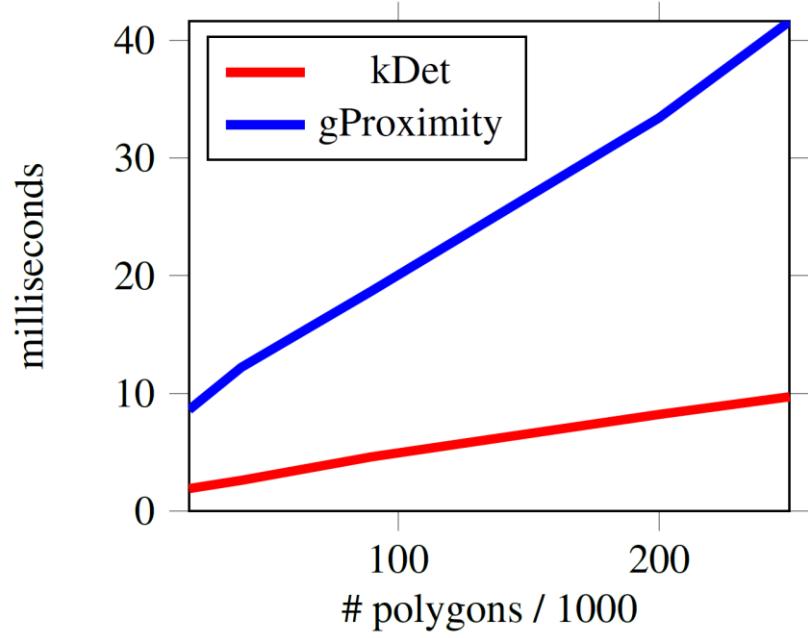
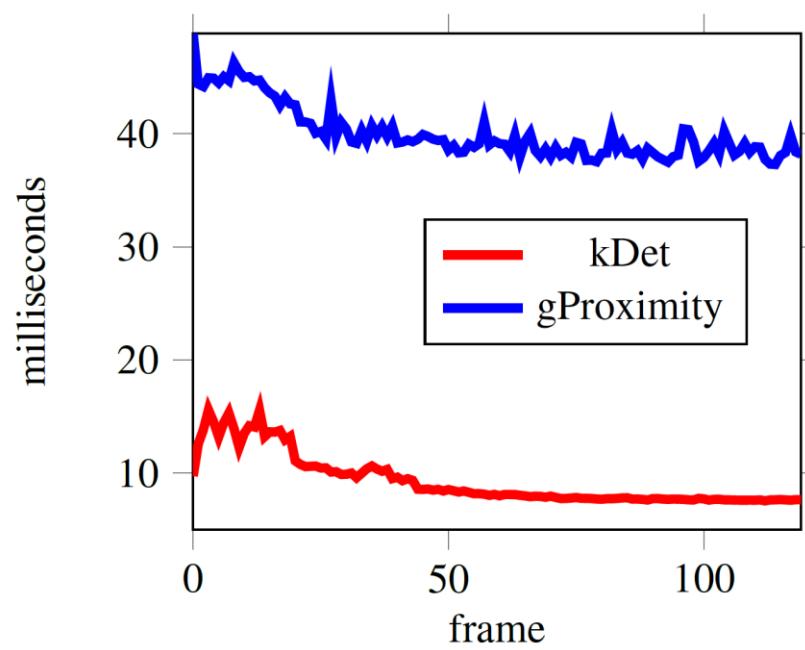
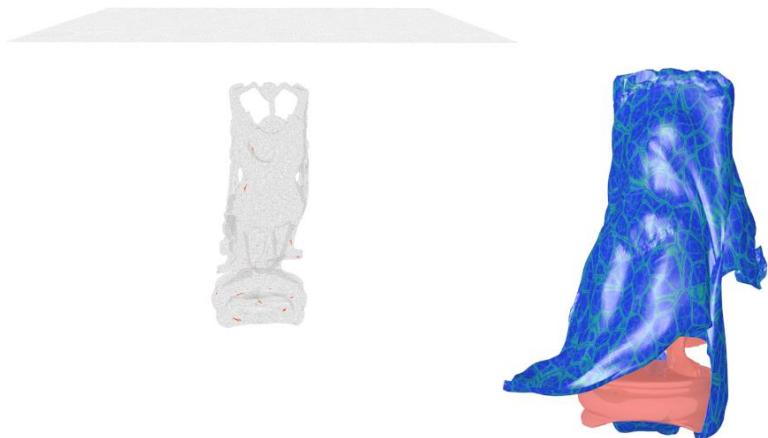
*Total Time:*  $O(n)$

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# Results

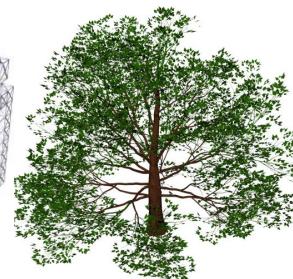
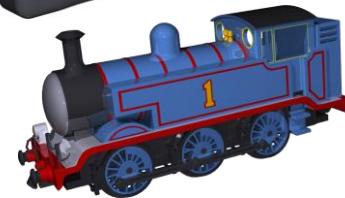


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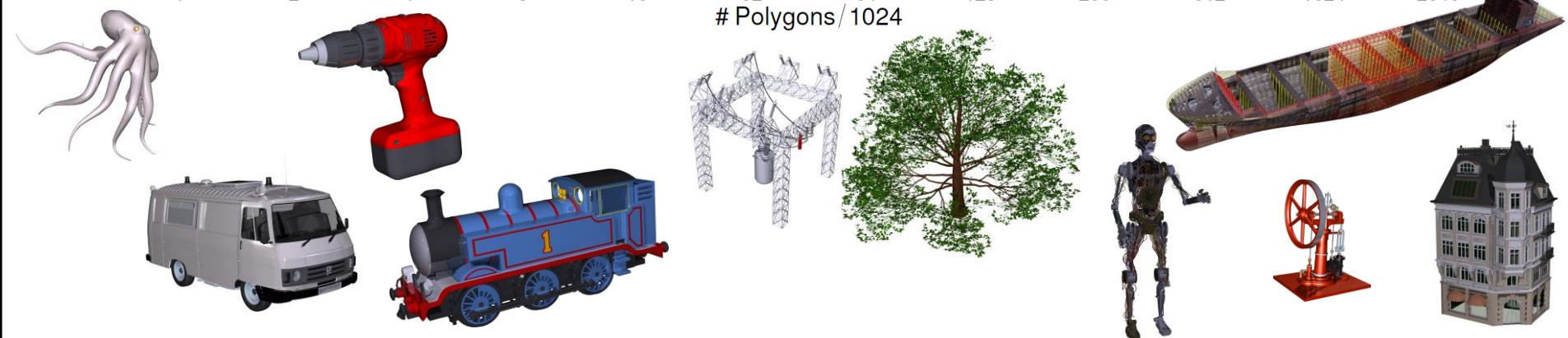
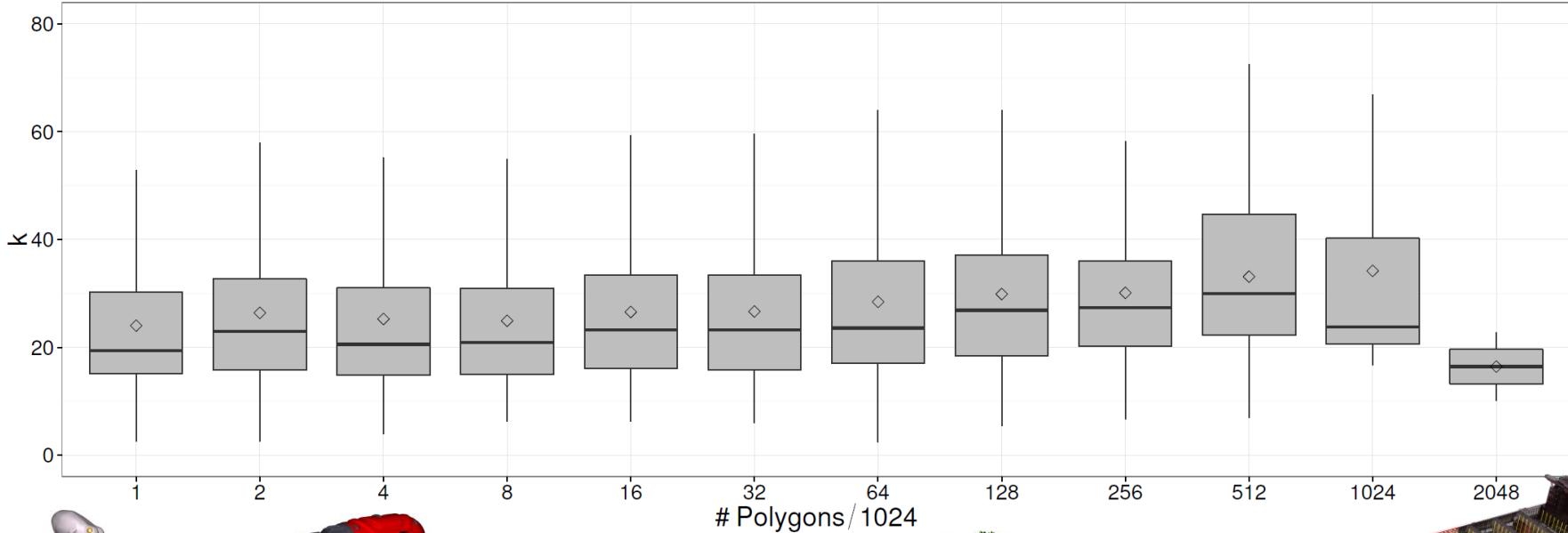
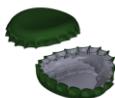




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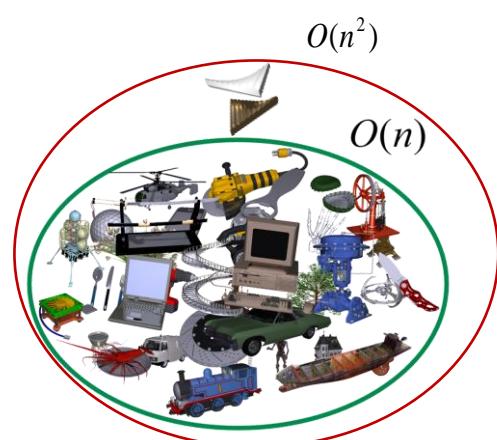


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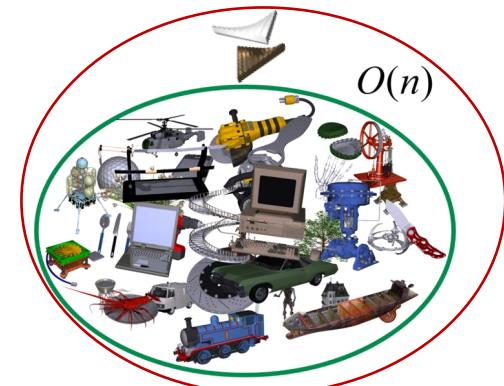
# Conclusions

- Novel geometric predicate for polygonal objects defining a class with provable  $O(n)$  worst-case intersecting polygon pairs
- Algorithm that realizes linear running-time
  - Parallel running-time:  $O(1)$
- <10 msec to check two objects with 250k triangles for collision



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- Algorithm that realizes linear running-time
  - Parallel running-time:  $O(1)$
- <10 msec to check two objects with 250k triangles for collision
- Future challenges:
  - Triangulations that optimize  $k$  and  $\frac{d_{\max}}{d_{\min}}$
  - Deformation methods that maintain  $k$  and  $\frac{d_{\max}}{d_{\min}}$
  - Application to other problems



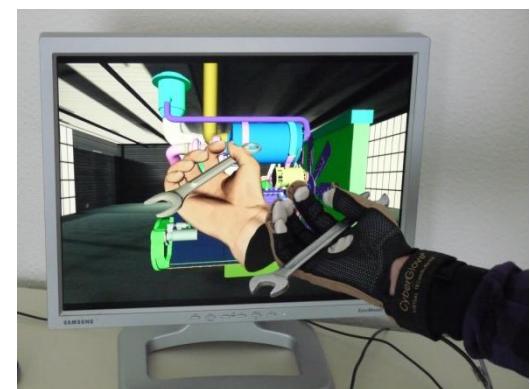
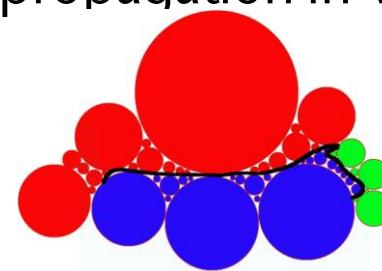
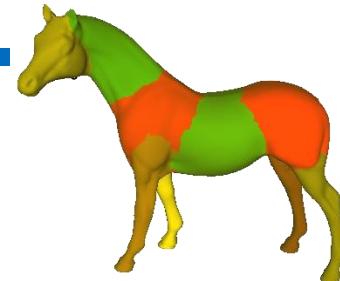
# More related MSc Thesis Topics

- Massively-parallel Voronoi diagram computation

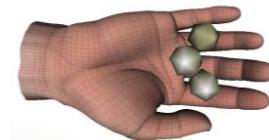
With  
**Protosphere**

- Massively-parallel machine learning algorithms for CG challenges (e.g. self-organizing-maps, k-means)
- Application of sphere packings to other CG challenges
  - Object classification
  - Object segmentation

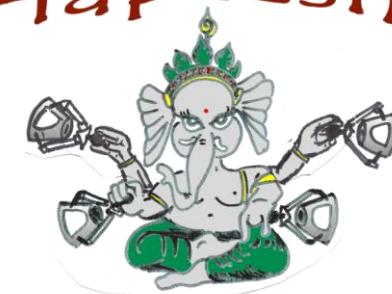
- Sphere-based sound propagation in VR
- 



# Pick Up Your MSc-Thesis!



Haptesha



Protosphere

Kinetic  
CollDet



VR-Coralreef

KINOPTIK

