

Opening holes in Discrete Objects with Digital Homotopy

Aldo Gonzalez-Lorenzo Alexandra Bac Jean-Luc Mari

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20 september 2017

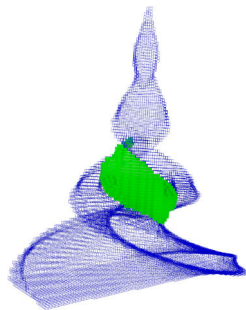
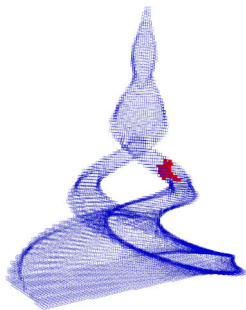




Structure

- 1 Motivation
- 2 Definition
- 3 Algorithms
- 4 Conclusion

1 Opening and closing holes with homology



2 Closing holes in discrete objects

- 1 Opening and closing holes with homology
- 2 Closing holes in discrete objects



Pattern Recognition Letters 23 (2002) 523–531

Pattern Recognition
Letters

www.elsevier.com/locate/patrec

A three-dimensional holes closing algorithm

Zouina Aktouf, Gilles Bertrand, Laurent Perroton *

Pattern Recognition 43 (2010) 3548–3559



Contents lists available at ScienceDirect

Pattern Recognition

journal homepage: www.elsevier.com/locate/pr



Hole filling in 3D volumetric objects

Marcin Janaszewski ^{a,*}, Michel Couprie ^b, Laurent>About ^a

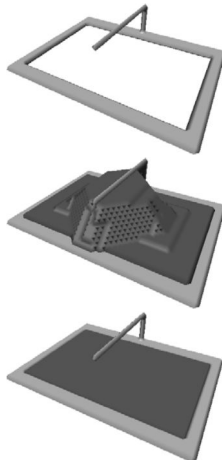
Pattern Recognition Letters 32 (2011) 2231–2238



Contents lists available at ScienceDirect

Pattern Recognition Letters

journal homepage: www.elsevier.com/locate/patrec



Robust algorithm for tunnel closing in 3D volumetric objects based on topological characteristics of points

Marcin Janaszewski ^{a,*}, Michał Postolski ^{a,b}, Laurent>About ^a

A little bit of opening holes



Topology-corrected segmentation and local intensity estimates for improved partial volume classification of brain cortex in MRI

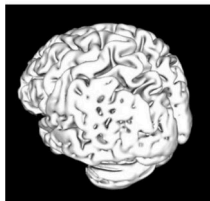
Andrea Rueda^{1,2}, Oscar Acosta^{1,2,3,4,*}, Michel Couprie⁵, Pierrick Bourgeat², Jurgen Fripp², Nicholas Dowson², Eduardo Romero², Olivier Salvado²



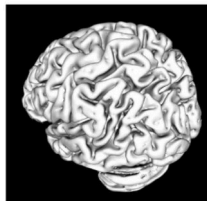
(a)



(b)



(c)



(d)

Structure

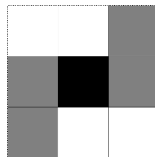
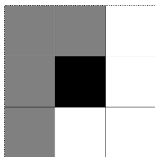
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2 Definition

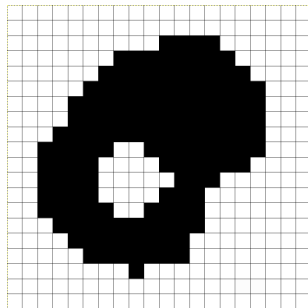
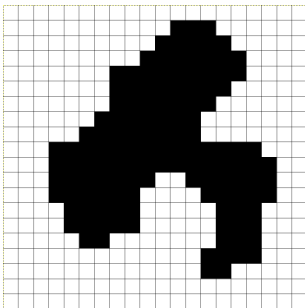
3 Algorithms

4 Conclusion

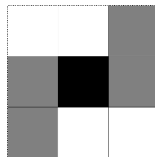
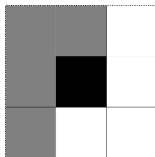
■ Simple point



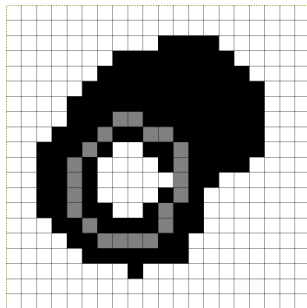
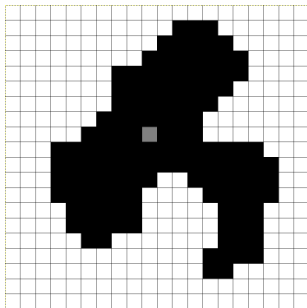
■ Contractible object



■ Simple point



■ Contractible object

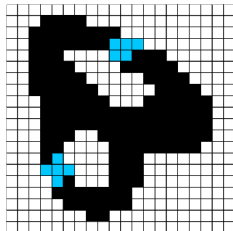
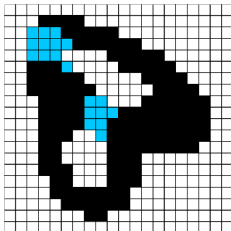
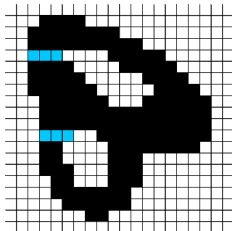
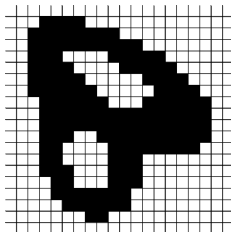


Homotopic opening

Let X be a discrete object.

$Y \subset X$ is a *homotopic opening* if

$X - Y$ is contractible



Structure

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KISS algorithm

Input: $X \subset \mathbb{Z}^d$

Output: Homotopic opening for X

$C \leftarrow \{x\}$, for $x \in X$;

$S \leftarrow N_\alpha^*(x) \cap (X - C)$;

while $S \neq \emptyset$ **do**

$x \leftarrow$ some point in S ;

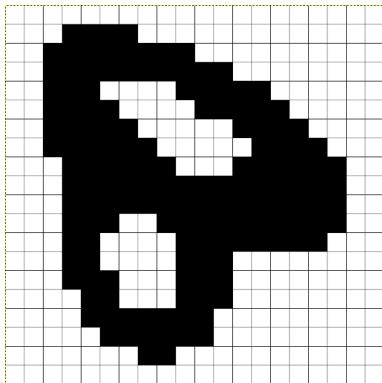
$S \leftarrow S - \{x\}$;

if x is simple for C **then**

$C \leftarrow C \cup \{x\}$;

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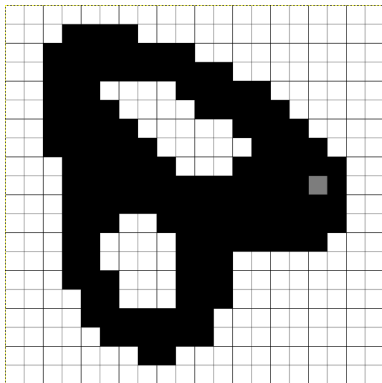
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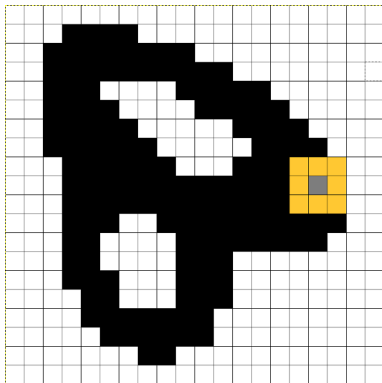
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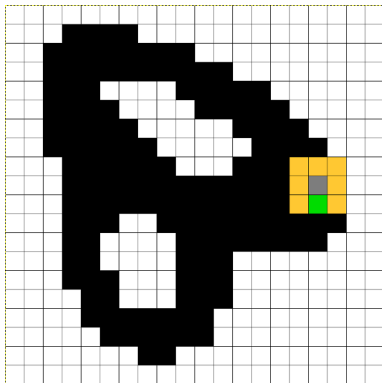
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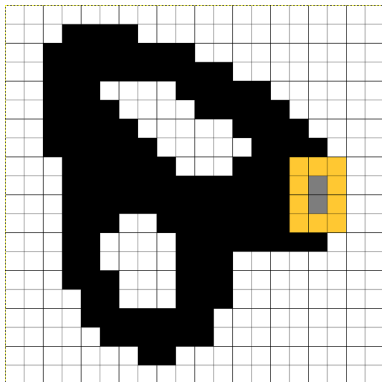
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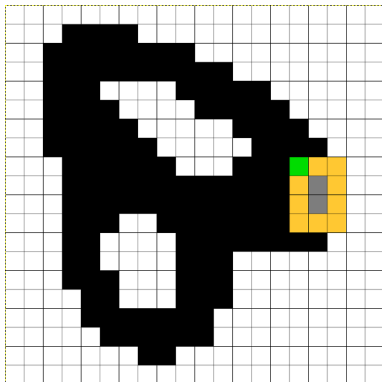
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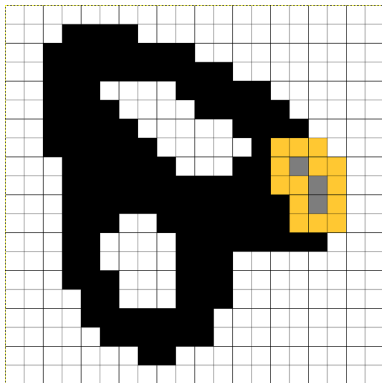
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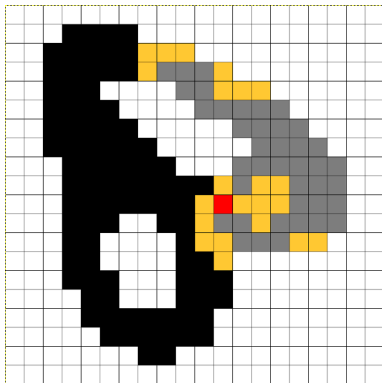
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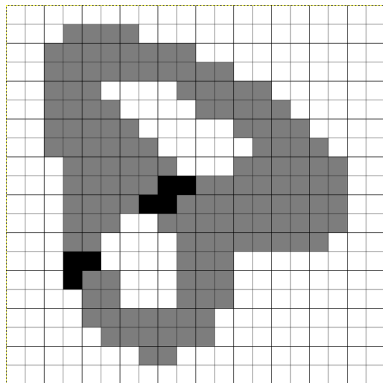
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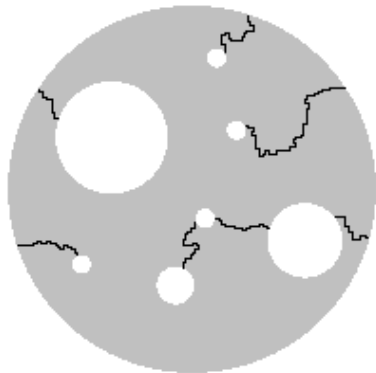
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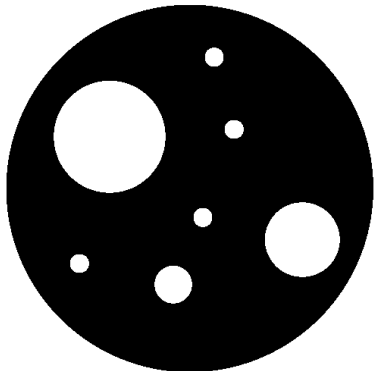
Better use the distance transform

Algorithm 1: random propagation

```

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  such that  $dt_X(x)$  is maximal;
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Complexity

$$dD: 3^d n (\lg n + f(d))$$

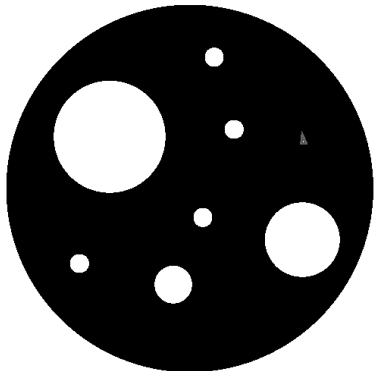
$$3D: n \lg n$$

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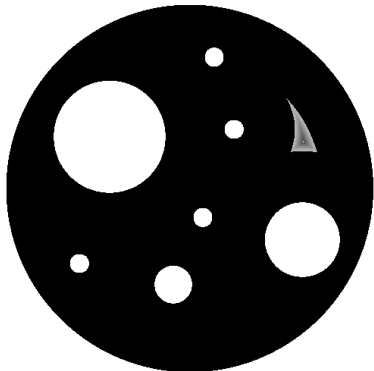
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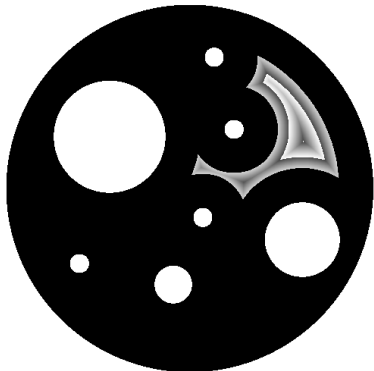
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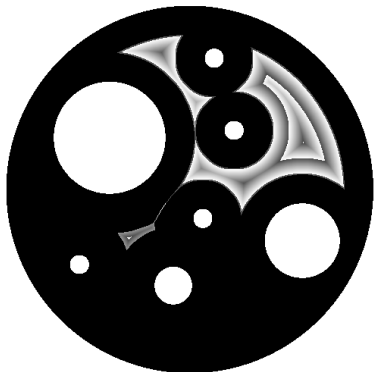
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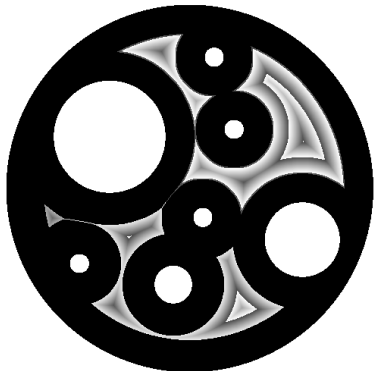
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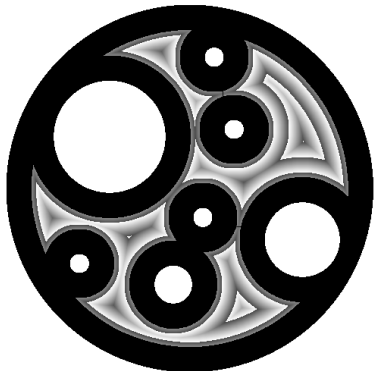
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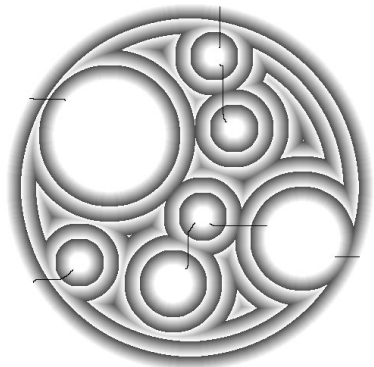
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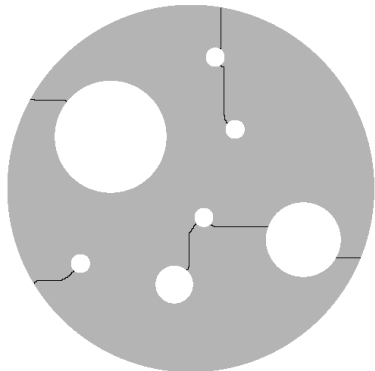
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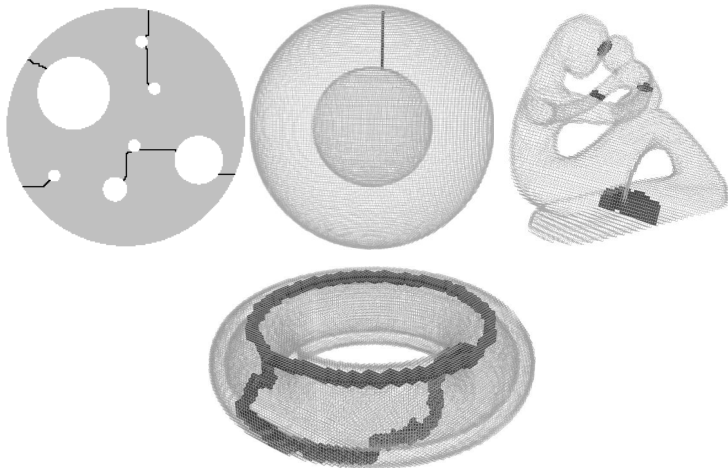
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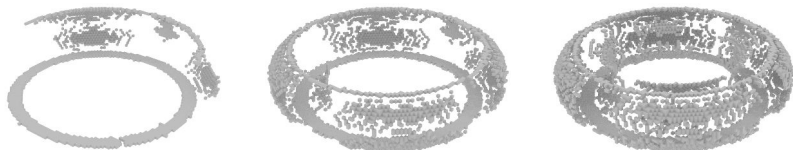
$$3D: n \lg n$$



Problems:

- Not straight lines → later
- Torus → next

What happens to the torus?



Too many points with equal distance

Solution: propagate by layers (Algorithm 2)

Algorithm 2: propagation by layers

$C \leftarrow \{x\}$, for random $x \in X$ with
highest dt_X value;

repeat

$m \leftarrow \max\{dt_X(x) \mid$
 $x \in N_\alpha^*(C) \cap X,$
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$L \leftarrow$

$dt_X^{-1}([m-1, m]) \cap N_\alpha^*(C)$;

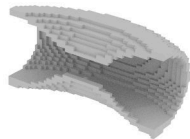
foreach $x \in L$ **do**

if x is simple for C **then**

$C \leftarrow C \cup \{x\}$;

until idempotency;

return $X - C$;



Complexity

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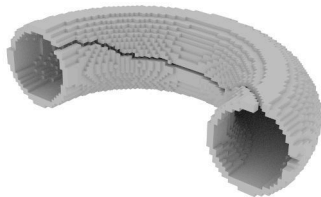
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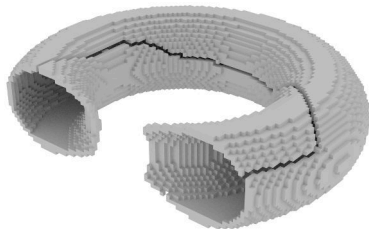
foreach $x \in L$ **do**

if x is simple for C **then**

$C \leftarrow C \cup \{x\};$

until idempotency;

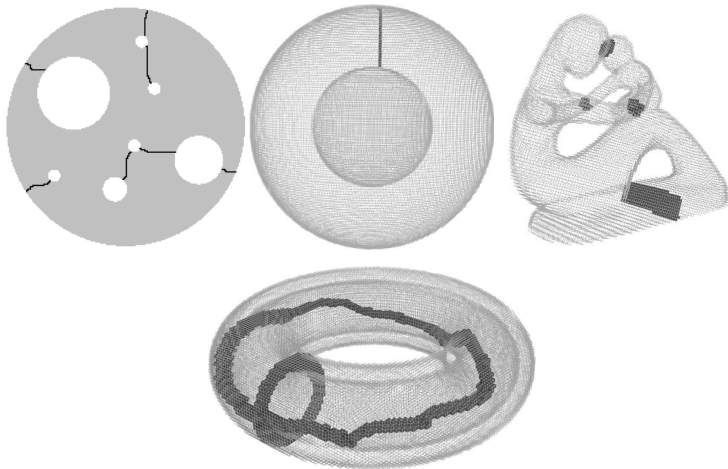
return $X - C;$



Complexity

$dD: 3^d n^2 f(d)$

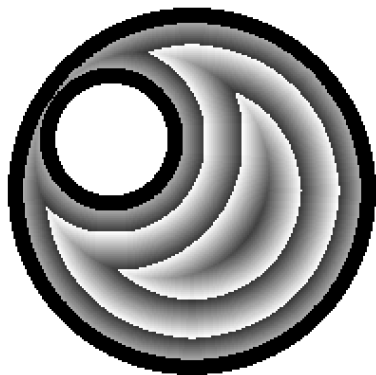
$3D: n^2$



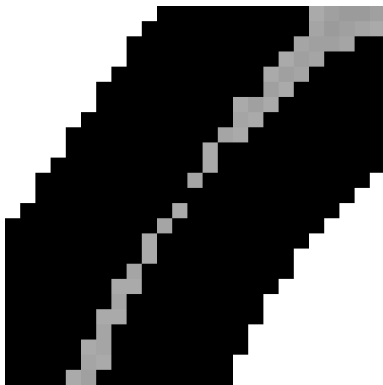
Problems:

- No straight lines → next
- Torus

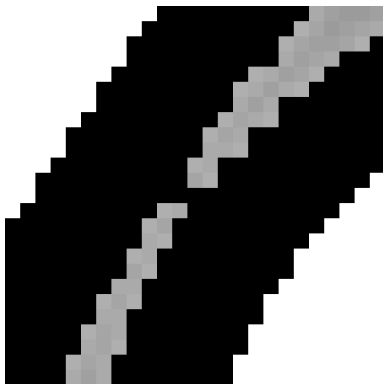
Why do we obtain those segments?



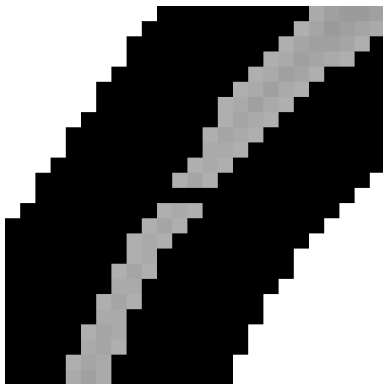
Why do we obtain those segments?



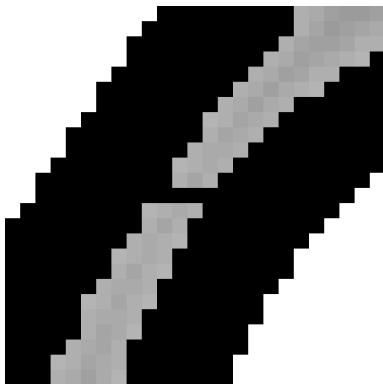
Why do we obtain those segments?



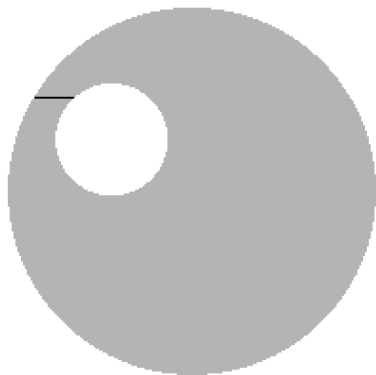
Why do we obtain those segments?



Why do we obtain those segments?



Why do we obtain those segments?



Solution: keep fronts separated (Plugin)

Plugin: simple balls

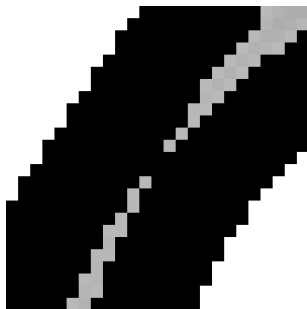
Input: $C \subset X$, $x \in X$, $r \geq 0$

Output: Can we add point x to C ?

```

foreach  $y \in N_\alpha(x)$  do
  if  $C \cup (B(y, r) \cap X)$  is
    collapsible to  $C$  then
    return true;
return false;

```



Complexity

$$dD: f(d) \rightarrow |N_\alpha| r^{2d} f(d)$$

$$3D: f(d) \rightarrow r^6$$

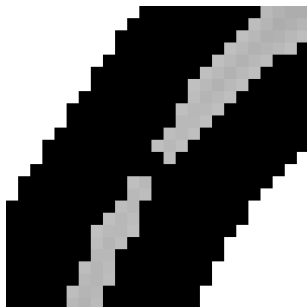
Plugin: simple balls

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$$3D: f(d) \rightarrow r^6$$

Plugin: simple balls

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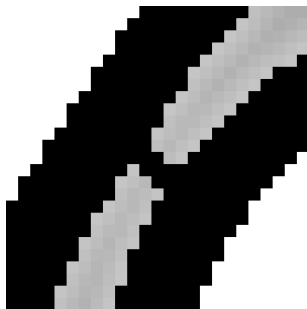
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    collapsible to  $C$  then
    return true;

```

return false;



Complexity

$$dD: f(d) \rightarrow |N_\alpha| r^{2d} f(d)$$

$$3D: f(d) \rightarrow r^6$$

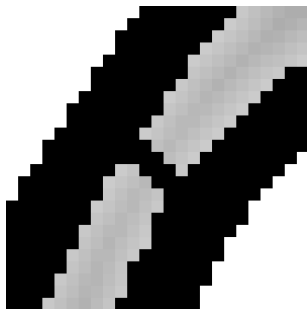
Plugin: simple balls

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```



Complexity

$$dD: f(d) \rightarrow |N_\alpha| r^{2d} f(d)$$

$$3D: f(d) \rightarrow r^6$$

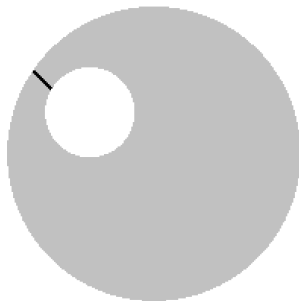
Plugin: simple balls

Input: $C \subset X$, $x \in X$, $r \geq 0$

Output: Can we add point x to C ?

```

foreach  $y \in N_\alpha(x)$  do
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```

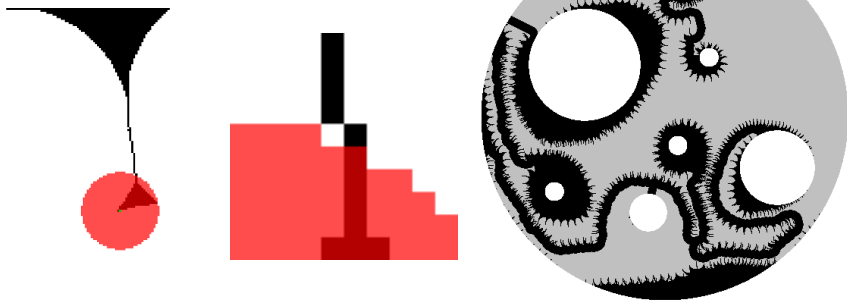


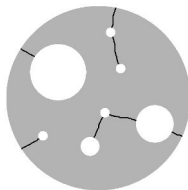
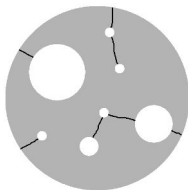
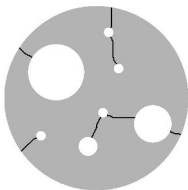
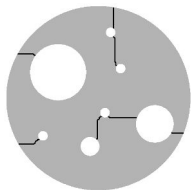
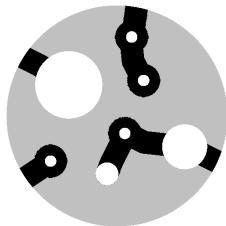
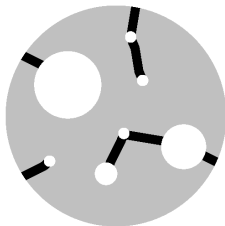
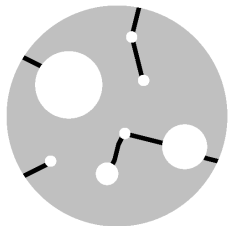
Complexity

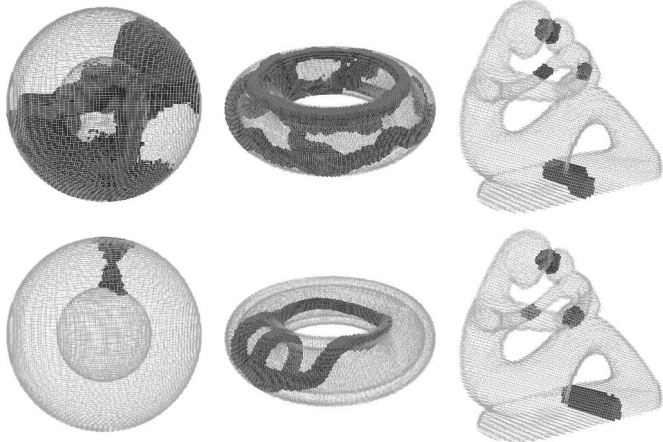
$$dD: f(d) \rightarrow |N_\alpha| r^{2d} f(d)$$

$$3D: f(d) \rightarrow r^6$$

Why the neighborhood? The *tangency problem*







Problems:

- 3D isn't great → some day

Structure

- 1 Motivation
- 2 Definition
- 3 Algorithms
- 4 Conclusion**

- 2 algorithms + 1 parameter for ball radius
- Algorithm 1: faster ($n \lg n$) but worse output
- Algorithm 2: slower (n^2) but better output
- Study the *tangency problem* in 3D

- 2 algorithms + 1 parameter for ball radius
- Algorithm 1: faster ($n \lg n$) but worse output
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- Study the *tangency problem* in 3D

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Thank you for your attention