

Reconstruction de formes en grandes dimensions

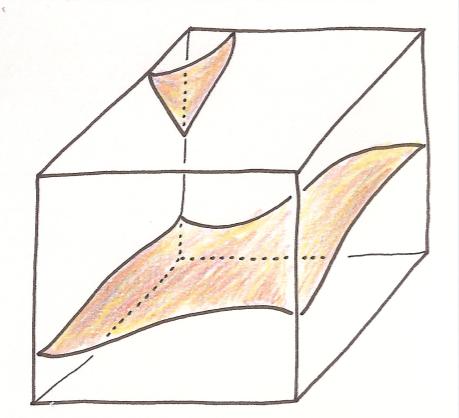
Dominique Attali

Co-authors: André Lieutier, David Salinas

*Conférence Mathématiques et Grandes Dimensions
de la théorie aux développements industriels*

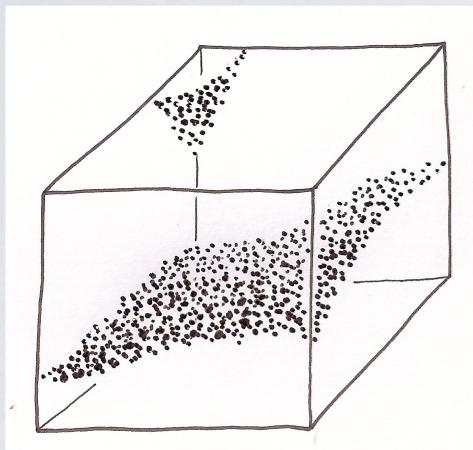
10 décembre 2012
Lyon

Shape



Approximation

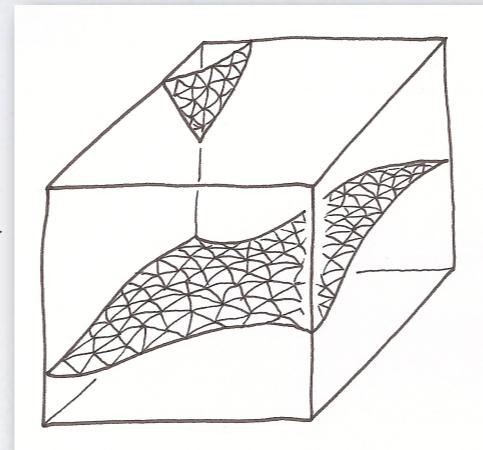
n points



Input

RECONSTRUCTION

Simplicial complex

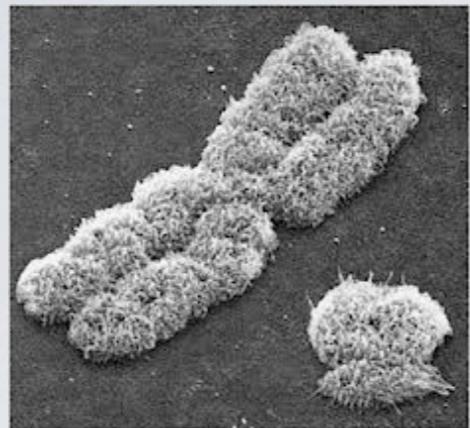


Output

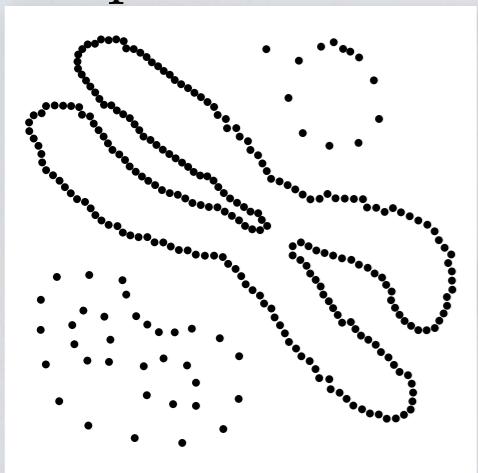
PROCESSING

- Betti numbers
- Volume
- Medial axis
- Signatures
- ...

in 2D

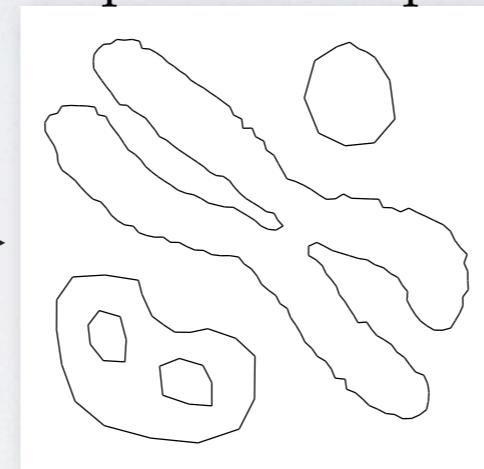


n points in \mathbb{R}^2



RECONSTRUCTION

Simplicial complex

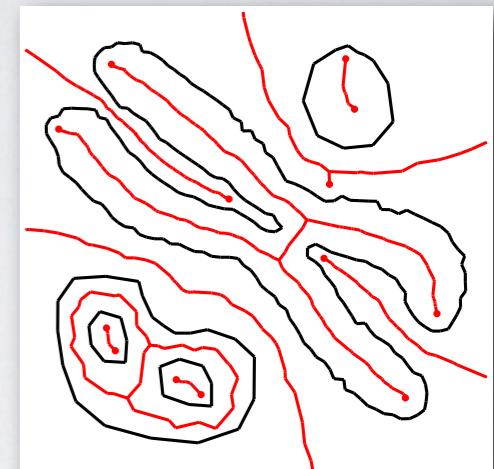


Input

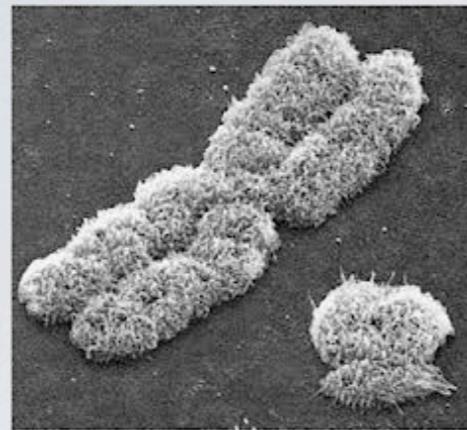
Output

PROCESSING

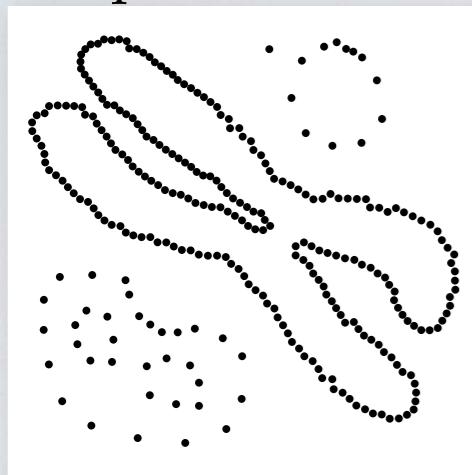
Medial axis



in 2D

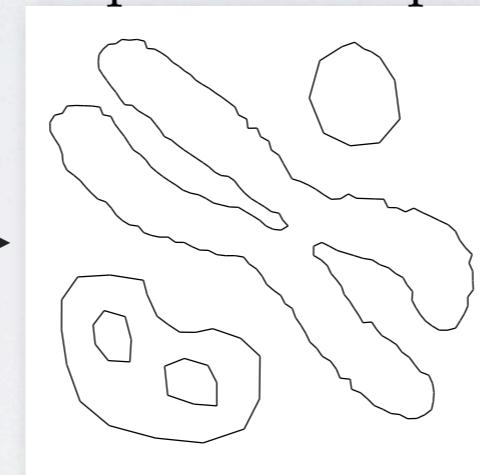


n points in \mathbb{R}^2



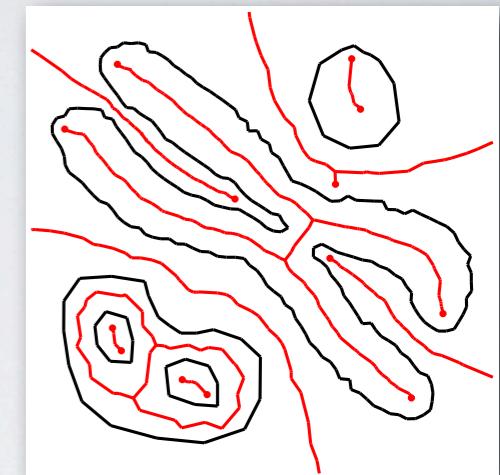
RECONSTRUCTION

Simplicial complex



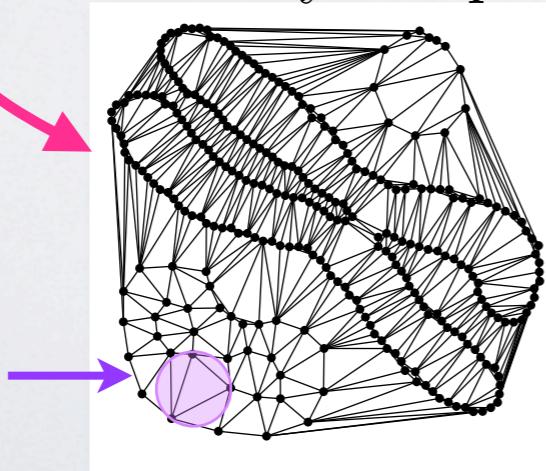
PROCESSING

Medial axis



BUILDING

Delaunay complex



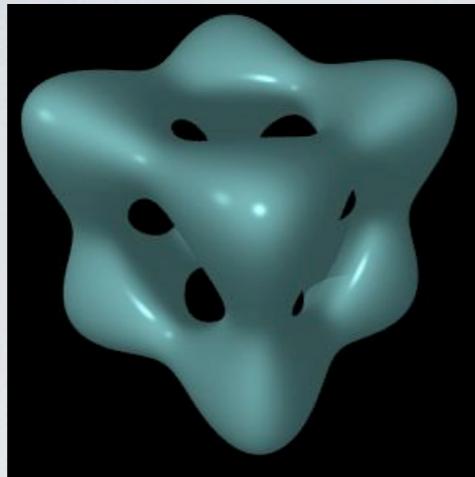
Empty circle property

* In \mathbb{R}^2 , has size $O(n)$

(1995 – 2005) HEURISTICS
(Crust, Power crust, Co-cone, Wrap, ...)

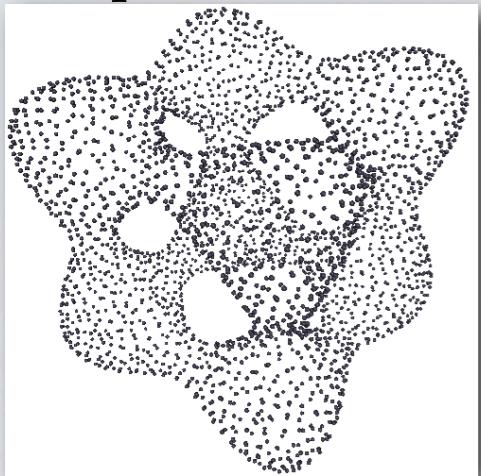


Delaunay of 10M points in 2D ≈ 10 s



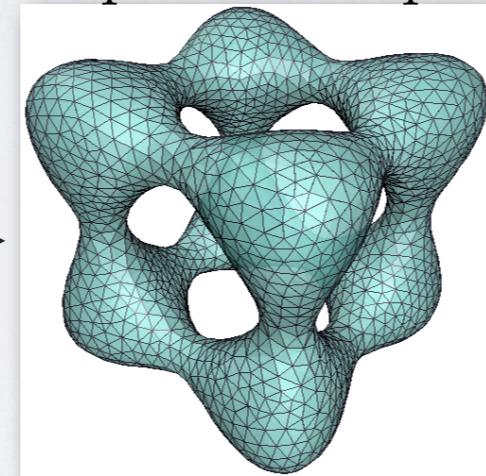
in 3D

n points in \mathbb{R}^3



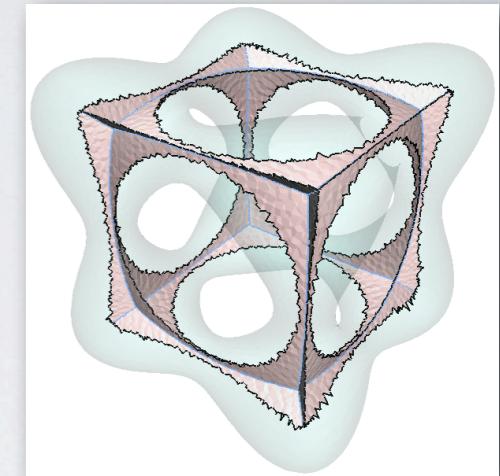
RECONSTRUCTION

Simplicial complex



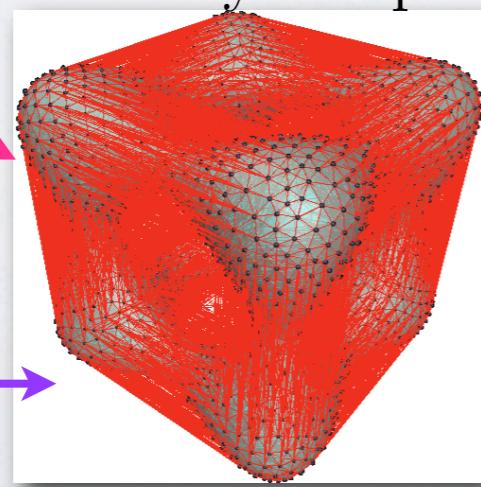
PROCESSING

Medial axis



BUILDING

Delaunay complex



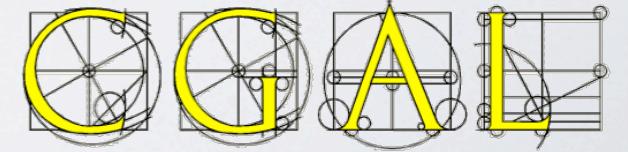
Empty sphere property



(1995 – 2005)

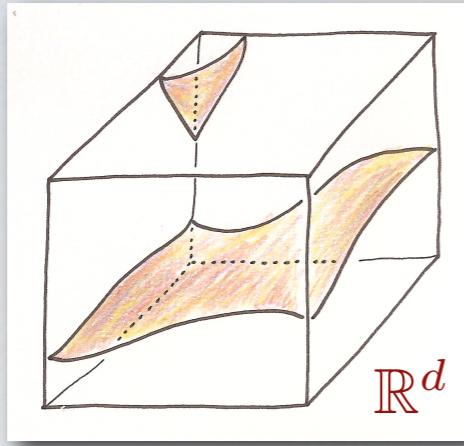
(Crust, Power crust, Co-cone, Wrap, ...)

- * In \mathbb{R}^3 , has size $O(n^2)$
- * In practice, has size $O(n)$

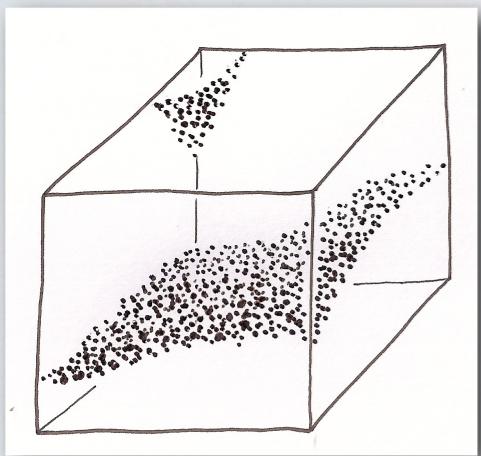


Delaunay of 10M points in 3D ≈ 80 s

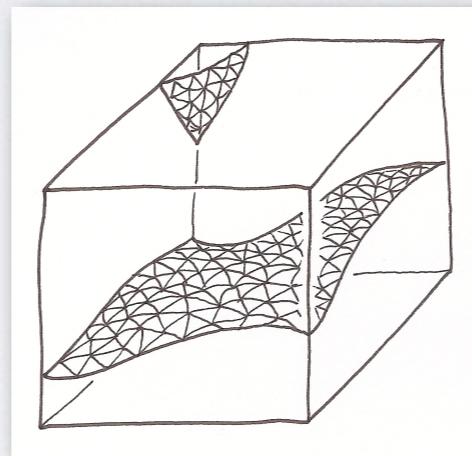
Shape



n points in \mathbb{R}^d



Simplicial complex



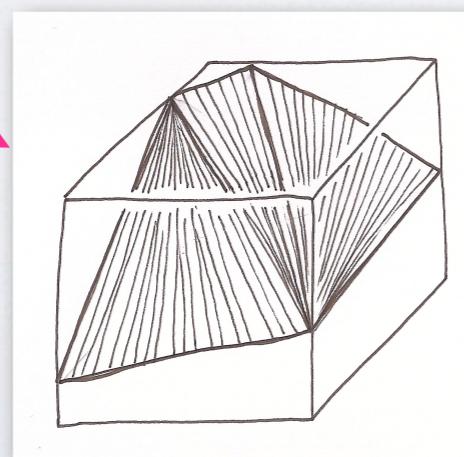
RECONSTRUCTION

PROCESSING

Betti numbers
Volume
Medial axis
Signatures
...

BUILDING

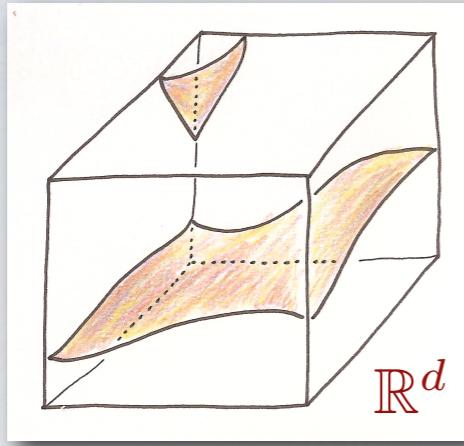
Delaunay complex



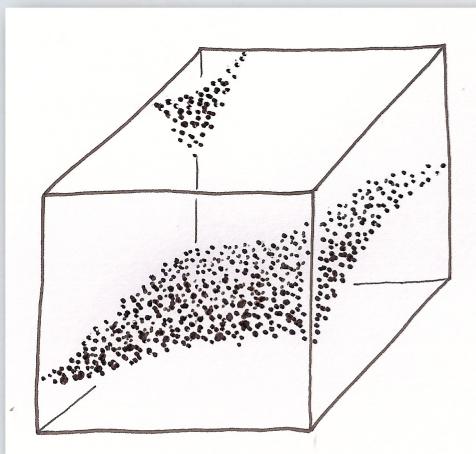
curse of dimensionality

- * In \mathbb{R}^d , has size $O(n^{\lceil d/2 \rceil})$
- * The bound is tight (and achieved for points that sample curves).

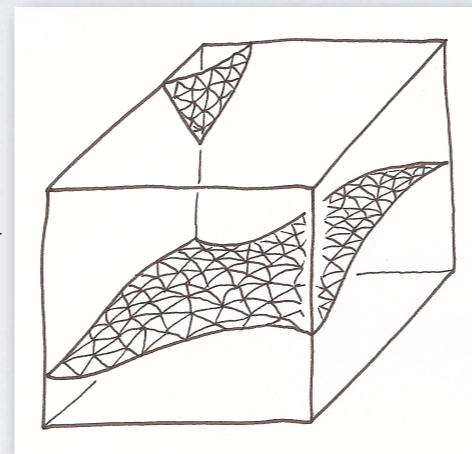
Shape



n points in \mathbb{R}^d



Simplicial complex



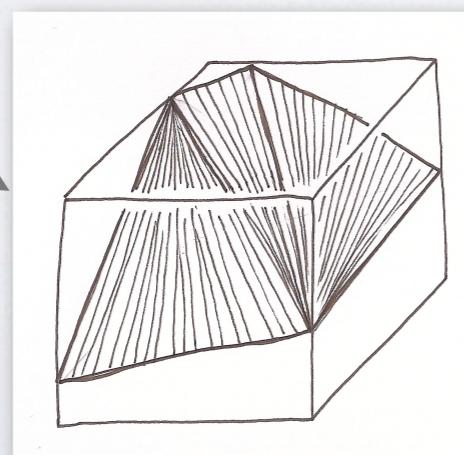
RECONSTRUCTION

PROCESSING

Betti numbers
Volume
Medial axis
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...

~~Building~~

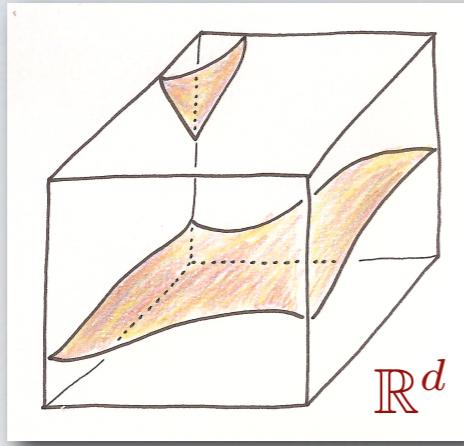
Delaunay complex



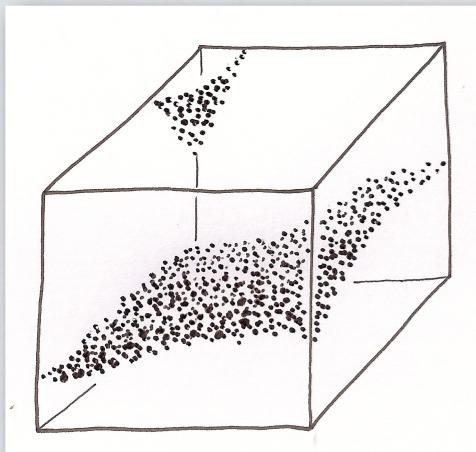
~~Building~~

How to reconstruct without Delaunay?

Shape



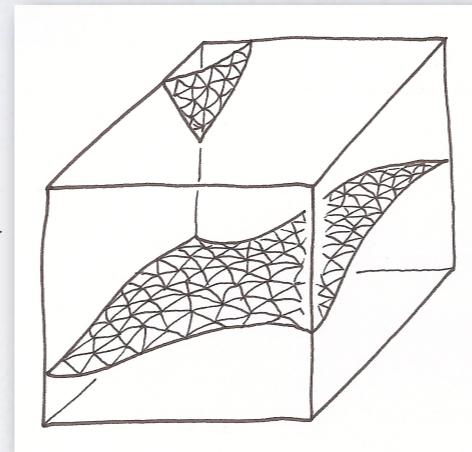
n points in \mathbb{R}^d



in dD

Guarantees on the result?

Simplicial complex



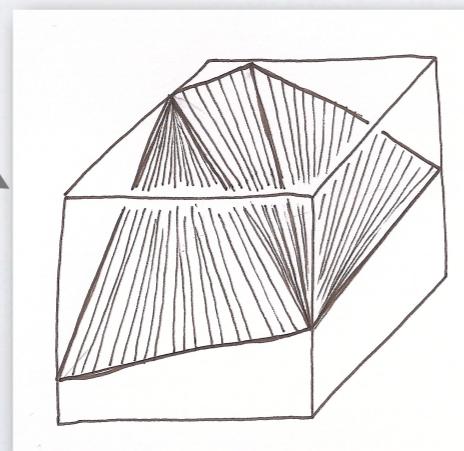
RECONSTRUCTION

PROCESSING

Betti numbers
Volume
Medial axis
Signatures
...

~~BUILDING~~

Delaunay complex



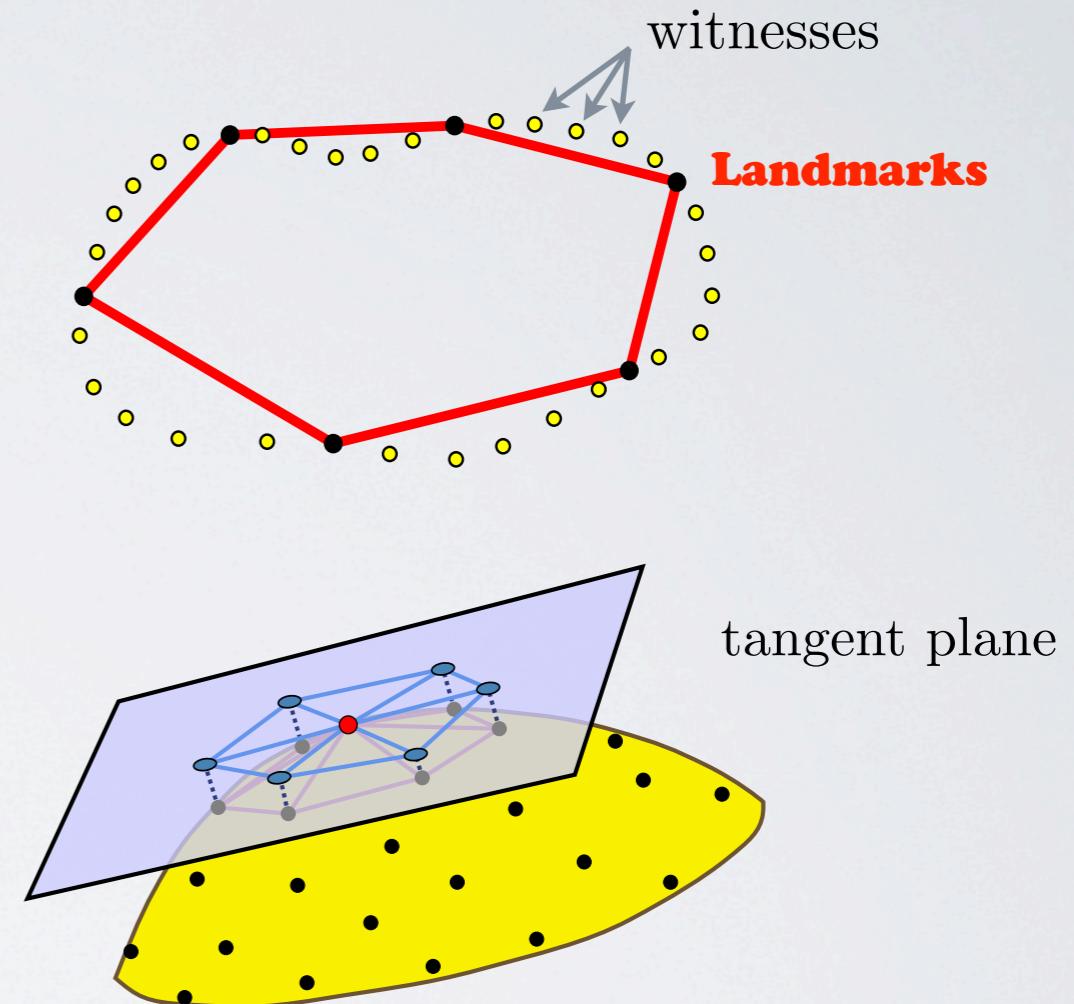
How to reconstruct without Delaunay?

How to reconstruct without building the whole Delaunay complex?

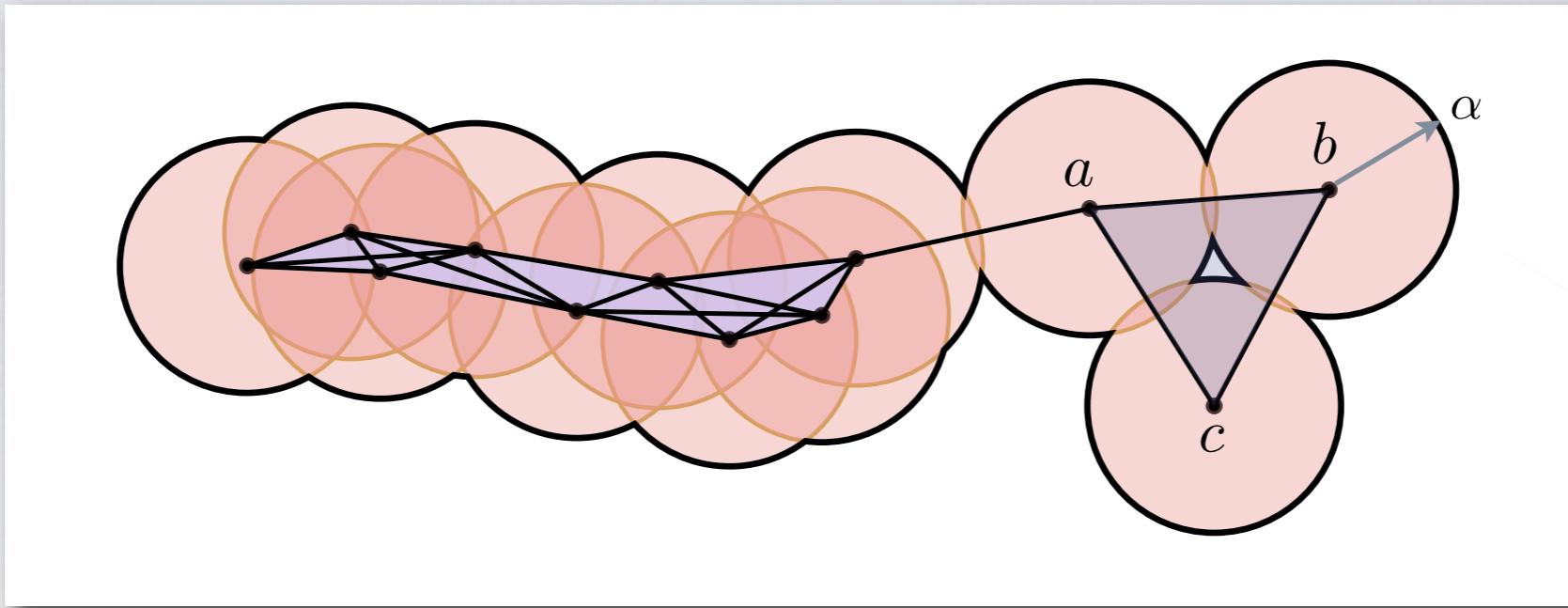
- * weak Delaunay triangulation
[V. de Silva 2008]

- * tangential Delaunay complexes
[J. D. Boissonnat & A. Ghosh 2010]

- * Rips complexes
our approach with André Lieutier and David Salinas



Rips complexes

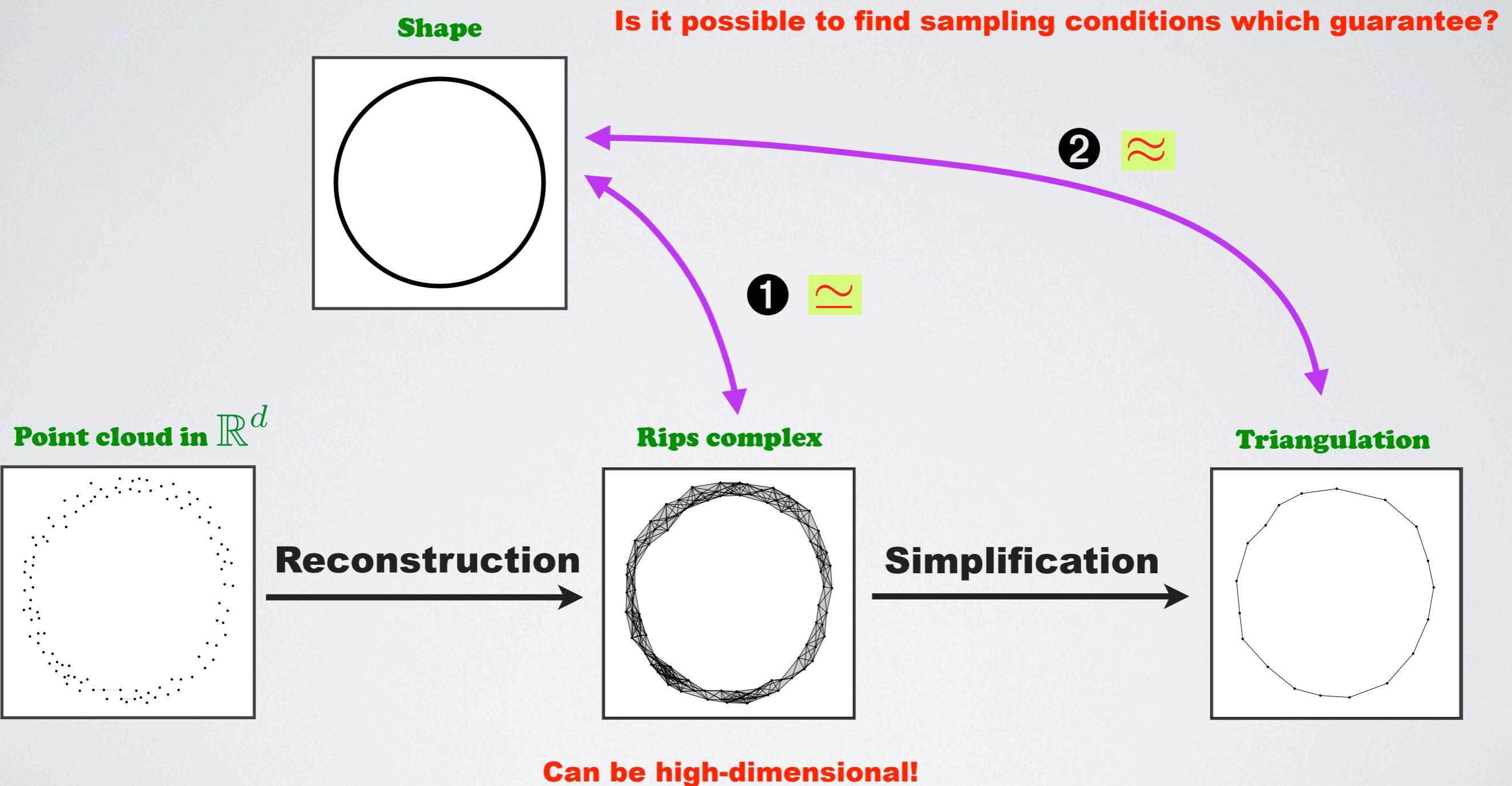


$$\text{Rips}(P, \alpha) = \{\sigma \subset P \mid \text{Diameter}(\sigma) \leq 2\alpha\}$$

$$\text{Rips}(P, \alpha) \supset \text{Cech}(P, \alpha)$$

- ✳ proximity graph G_α connects every pair of points within 2α
- ✳ $\text{Rips}(P, \alpha) = \text{Flag } G_\alpha$ [Flag G = largest complex whose 1-skeleton is G]
- ✳ compressed form of storage through the 1-skeleton
- ✳ easy to compute

Overview



Simplification by iteratively applying elementary operations

- * Edge contraction $ab \mapsto c$



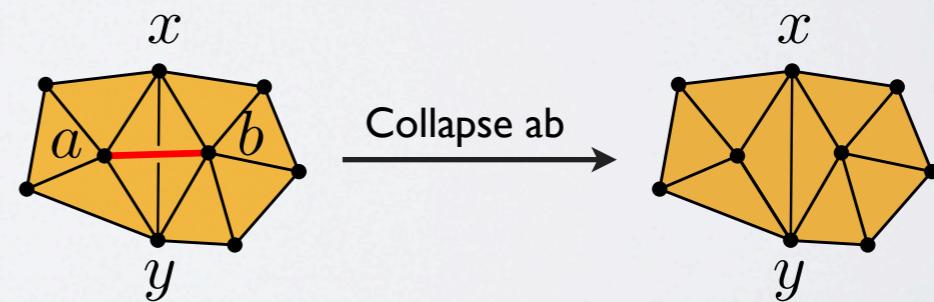
- * Identifies vertices a and b to vertex c
- * Preserves homotopy type if $\text{Lk}(ab) = \text{Lk}(a) \cap \text{Lk}(b)$
- * The result may not be a flag complex anymore . . .

⇒ data structure = (1-skeleton, blocker set)

σ blocker of K iff $\dim \sigma \geq 2$, $\forall \tau \subsetneq \sigma$, $\tau \in K$ and $\sigma \notin K$

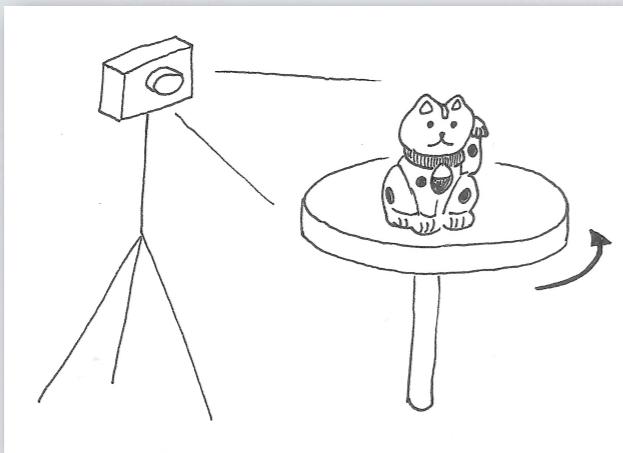
- * Collapse of a simplex σ

- * Removes σ and its cofaces
- * Preserves homotopy type if $\text{Lk}(\sigma)$ is a cone
- * The result is a flag complex if σ a vertex or an edge

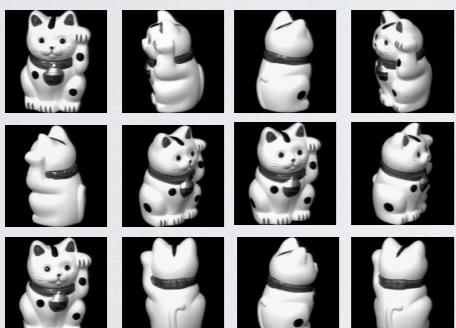


Example

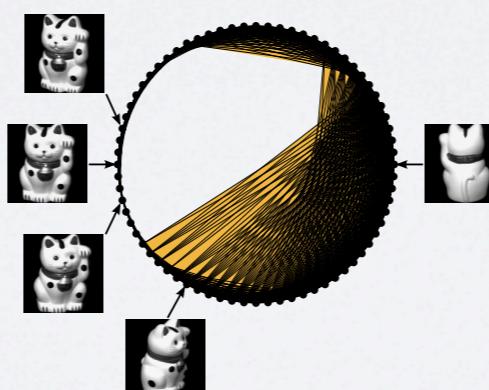
Physical system



Point cloud in \mathbb{R}^{128^2}

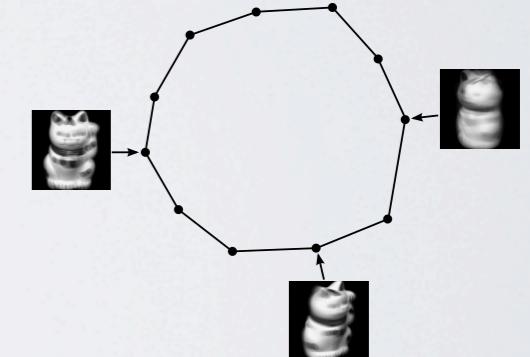


Rips complex



Correct homotopy type

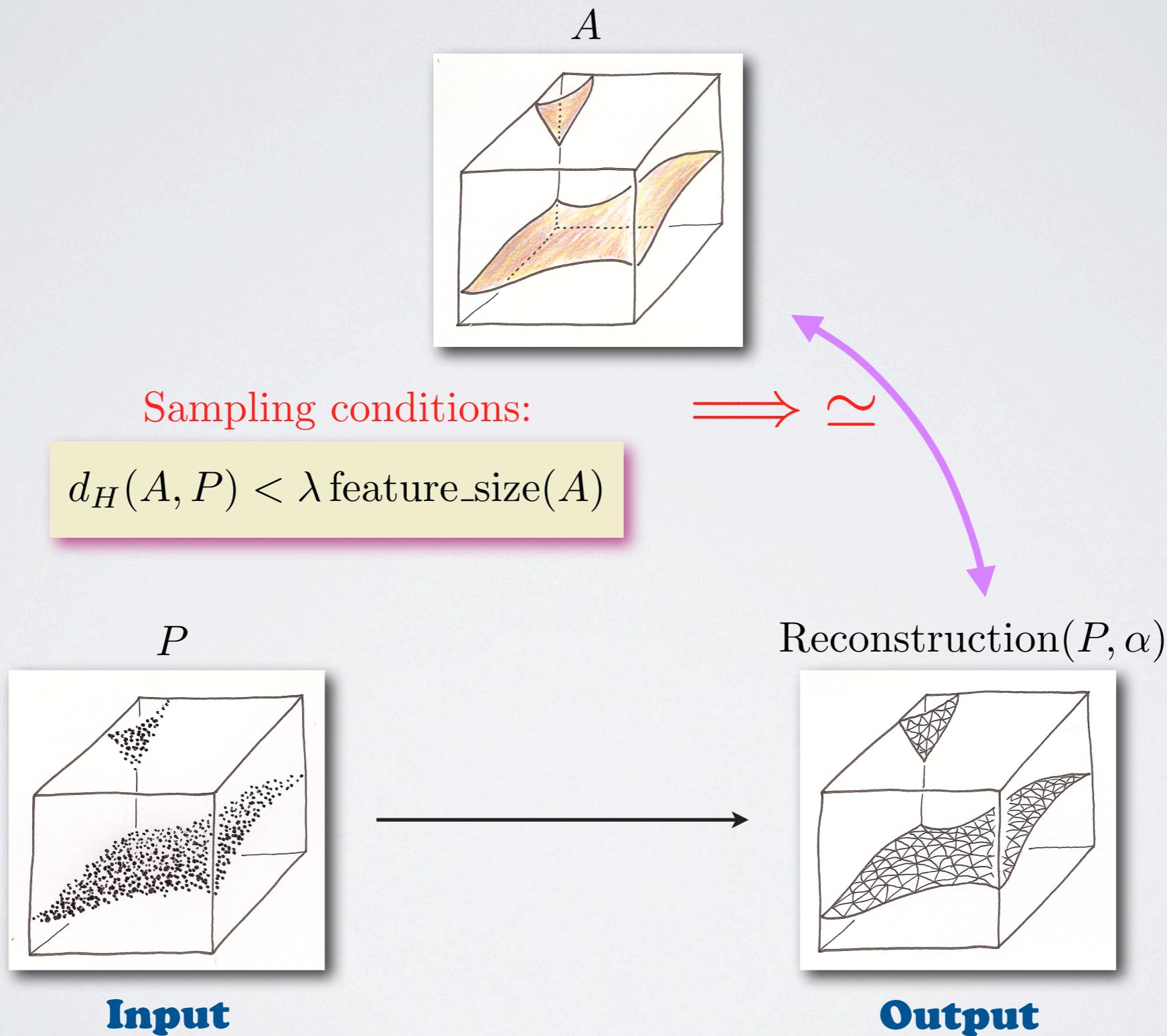
Polygonal curve



Correct intrinsic dimension

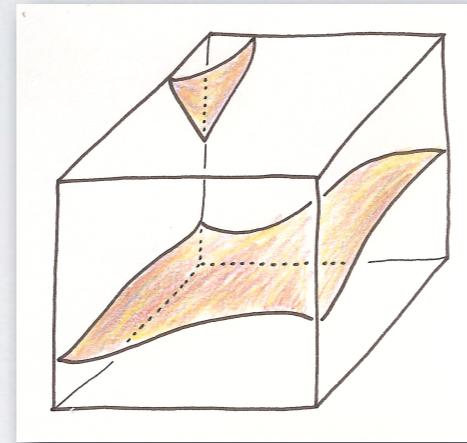
Is high-dimensional!

Reconstruction theorems



Reconstruction theorems

A



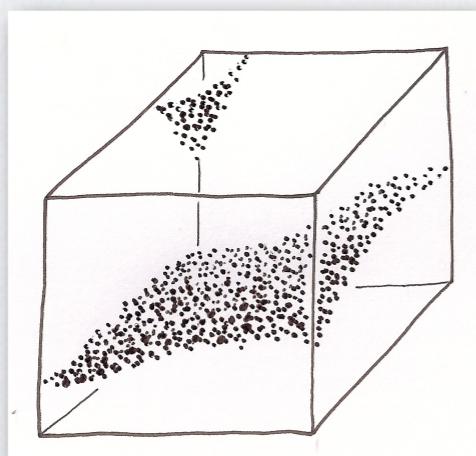
Sampling conditions:

$$d_H(A, P) < \lambda \text{feature_size}(A)$$

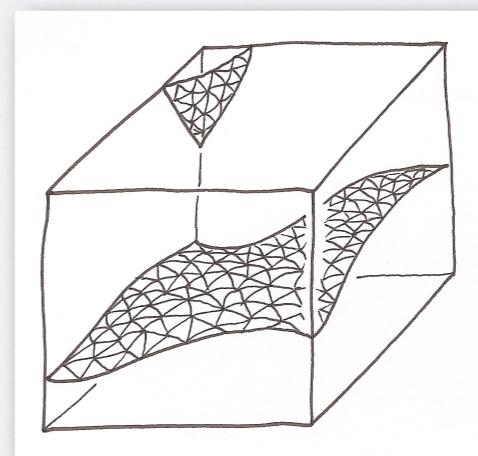
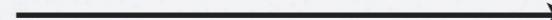
$$\Rightarrow \approx$$

Reconstruction(P, α)

P



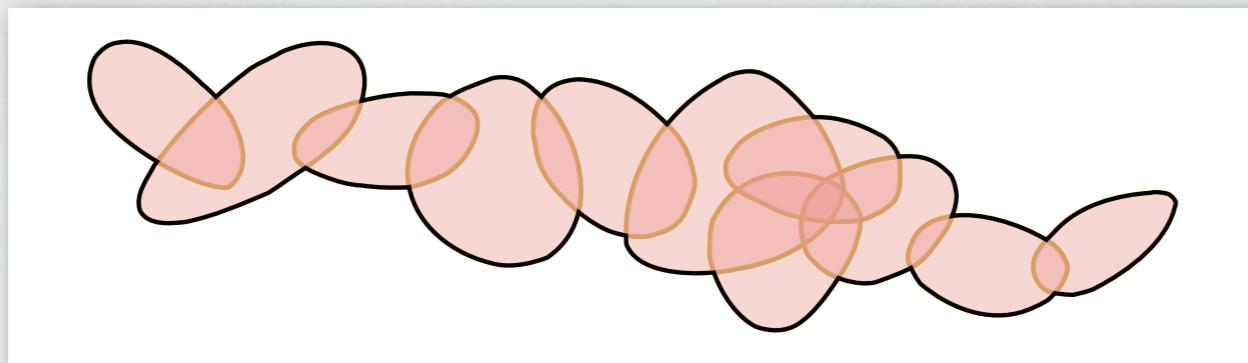
Input



Output

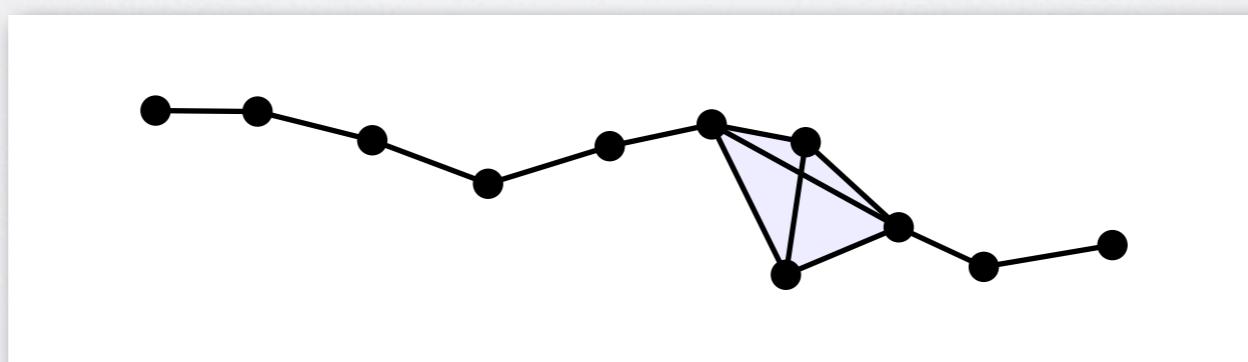
Nerve

$\bigcup \mathcal{C}$, where \mathcal{C} finite collection of sets



If sets in \mathcal{C} are convex
 \simeq **Nerve Lemma.**

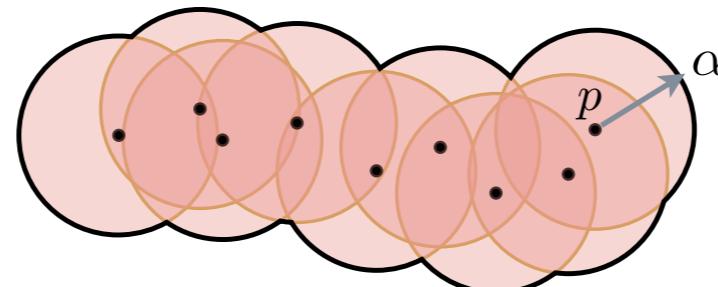
$$\text{Nerve } \mathcal{C} = \{\eta \subset \mathcal{C} \mid \bigcap \eta \neq \emptyset\}$$



Cech complex

$$P^\alpha = \bigcup_{p \in P} B(p, \alpha)$$

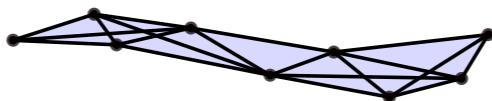
α -offset of P



\simeq

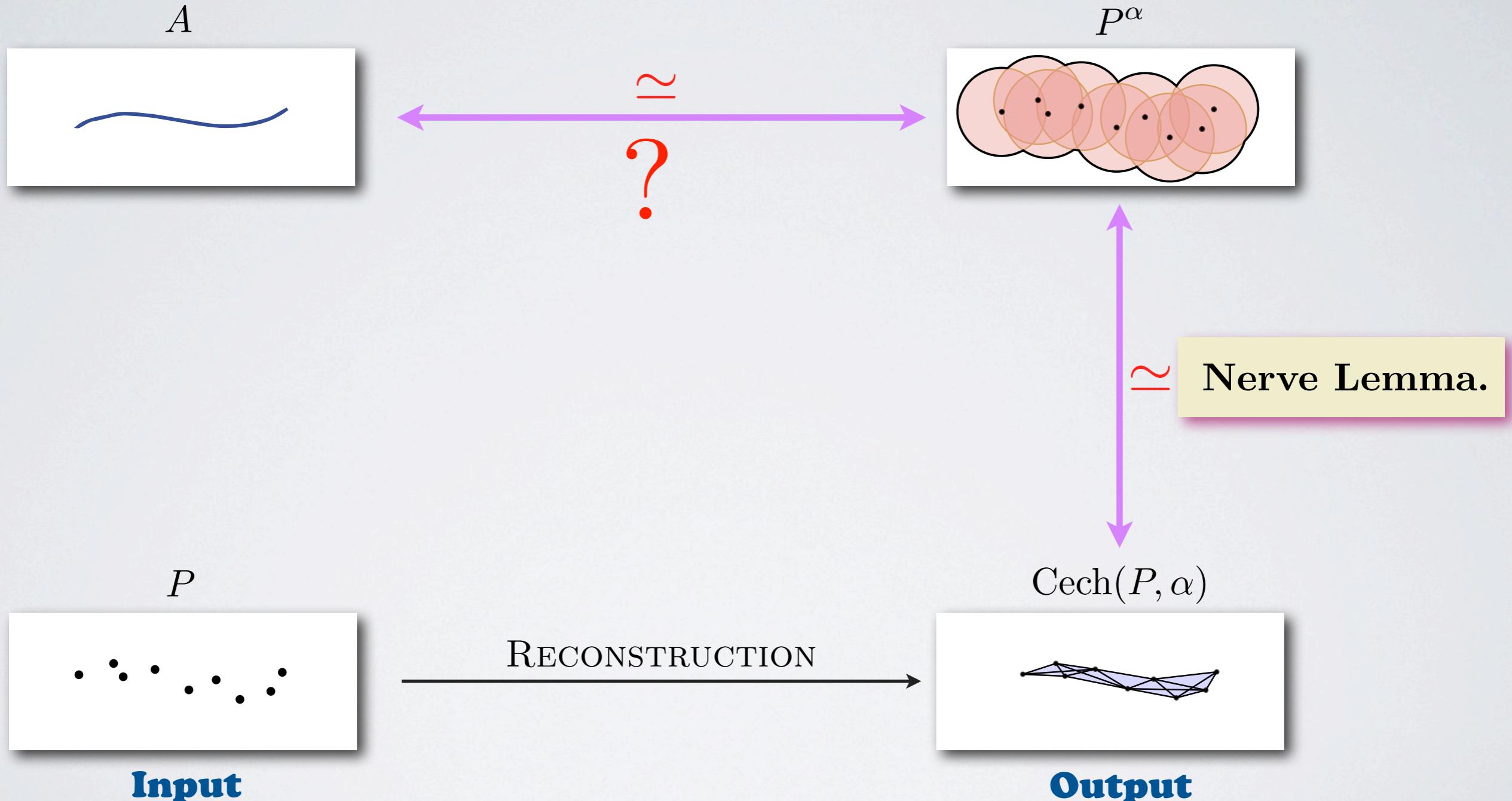
Nerve Lemma.

$$\text{Cech}(P, \alpha) = \text{Nerve}\{B(p, \alpha) \mid p \in P\}$$

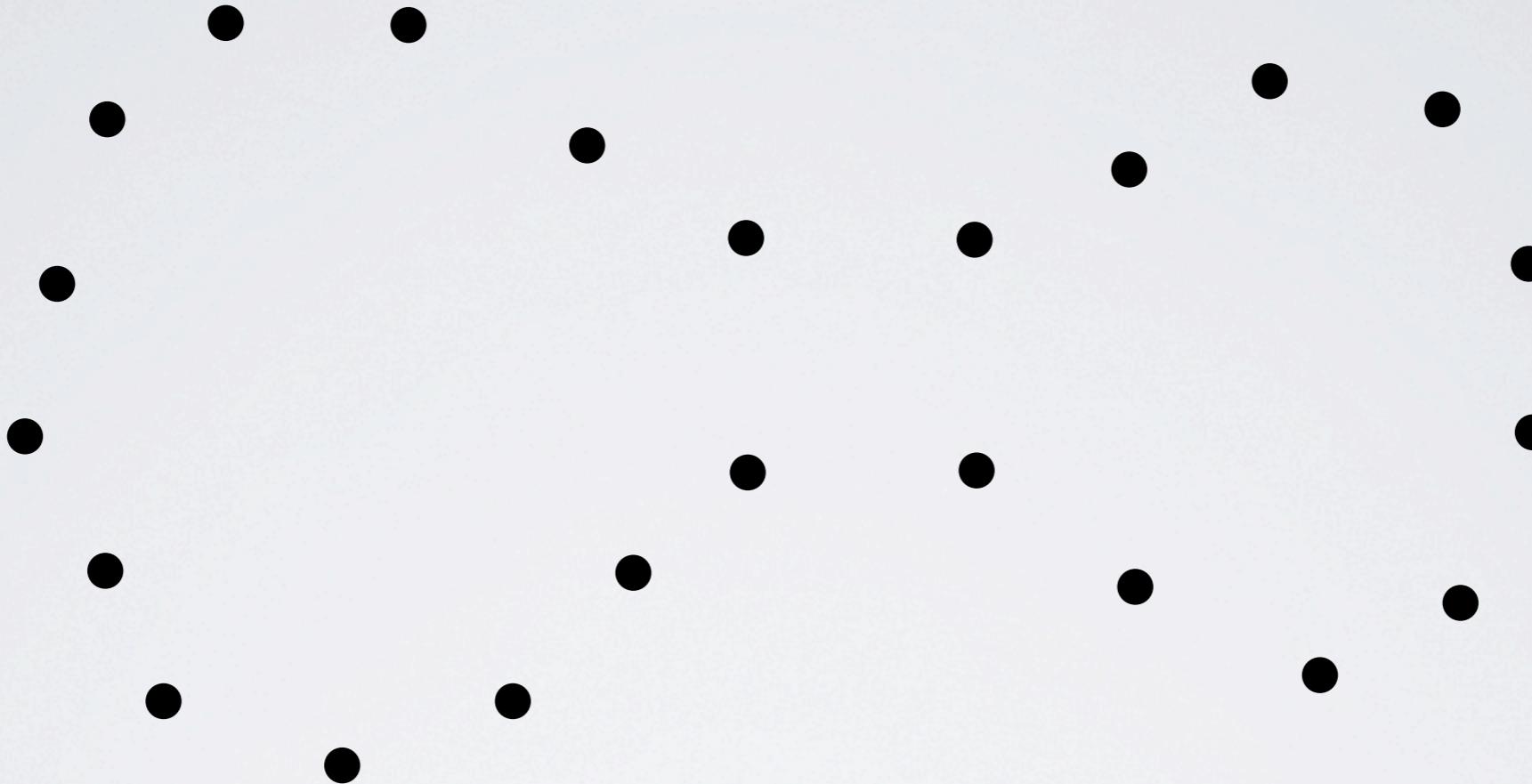


Can be
high-dimensional!
&
expensive to compute

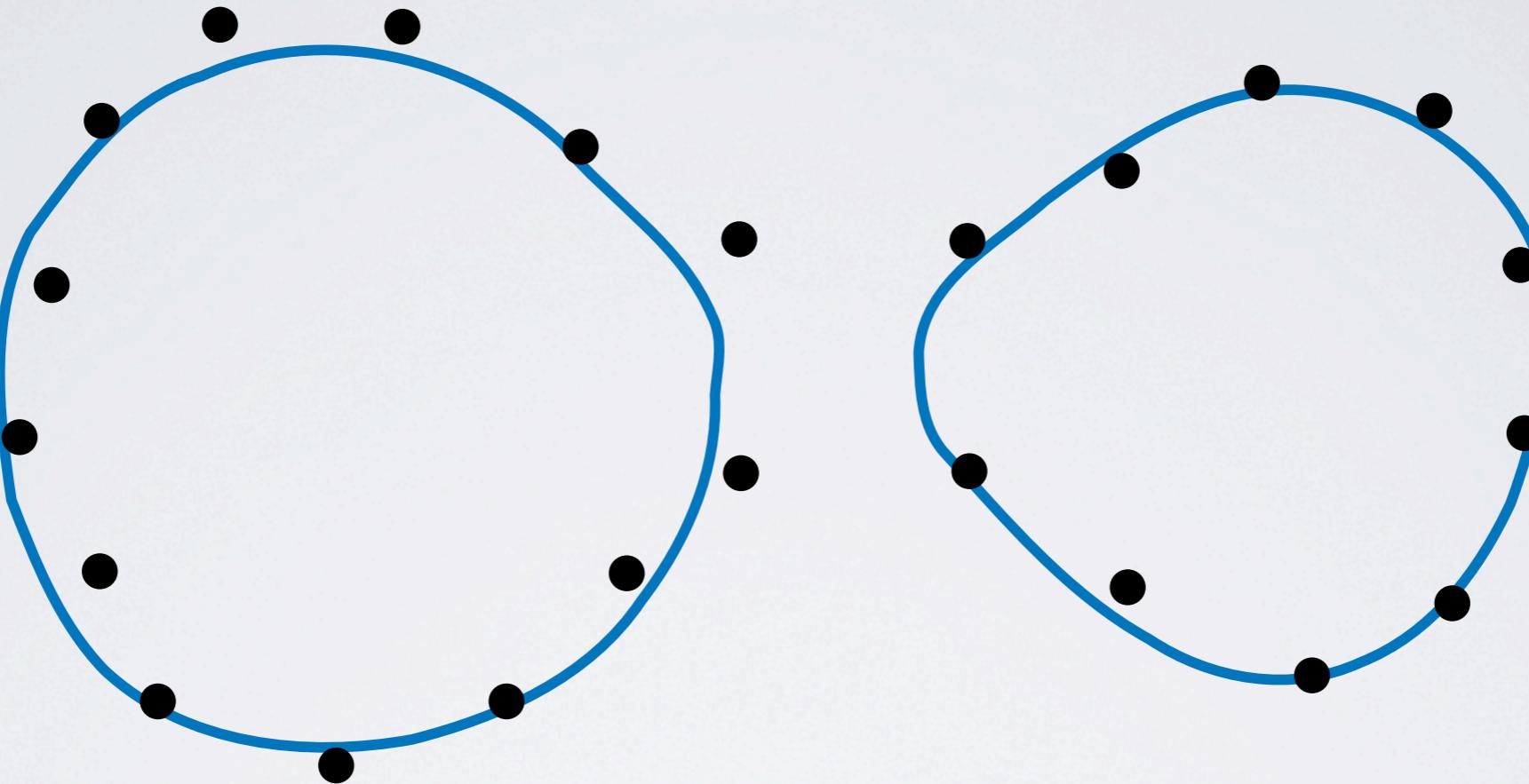
Cech complex



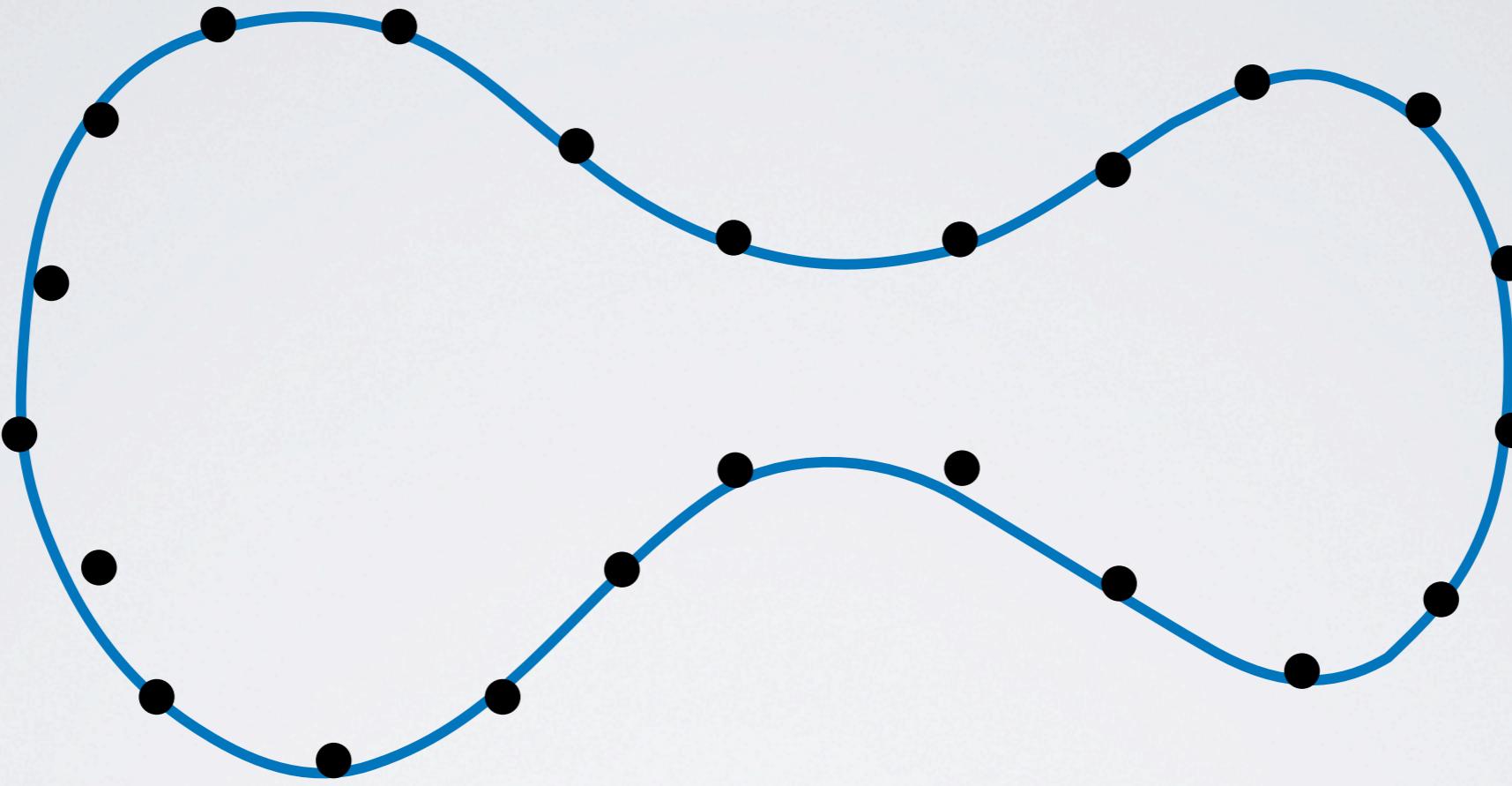
Shapes and Reach



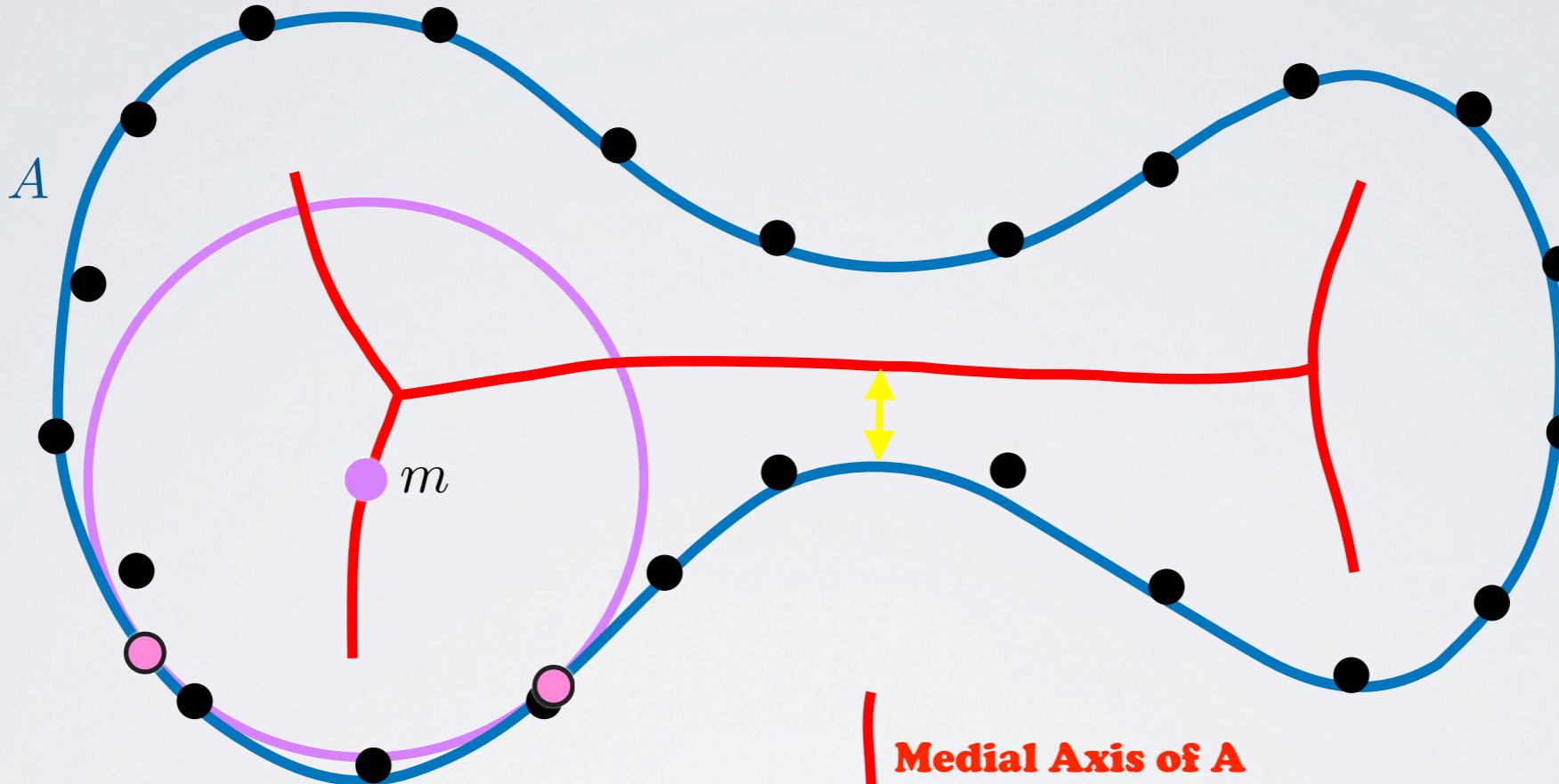
Shapes and Reach



Shapes and Reach



Shapes and Reach

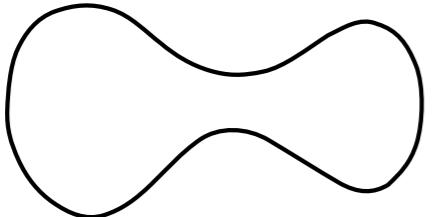


$\text{MedialAxis}(A) = \{m \in \mathbb{R}^d \mid m \text{ has at least two closest points in } A\}$

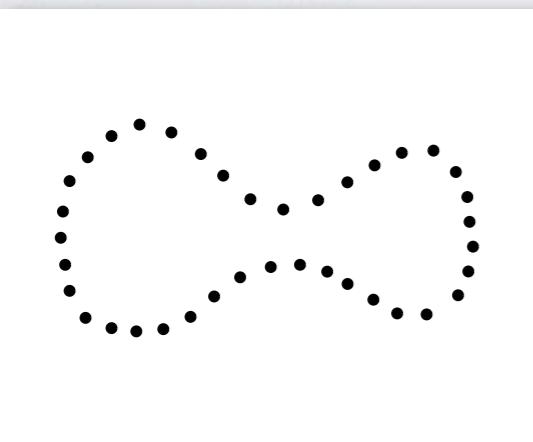
Reach $A = d(A, \text{MedialAxis}(A))$

Cech complex

A



P



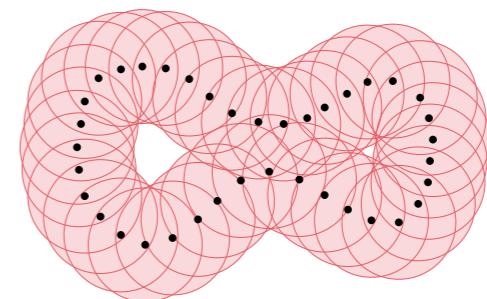
Input

[Niyogi Smale Weinberger 2004]
deformation retracts to
if

$$d_H(A, P) \leq \varepsilon < (3 - \sqrt{8}) \text{ Reach } A$$

$$\alpha = (2 + \sqrt{2})\varepsilon$$

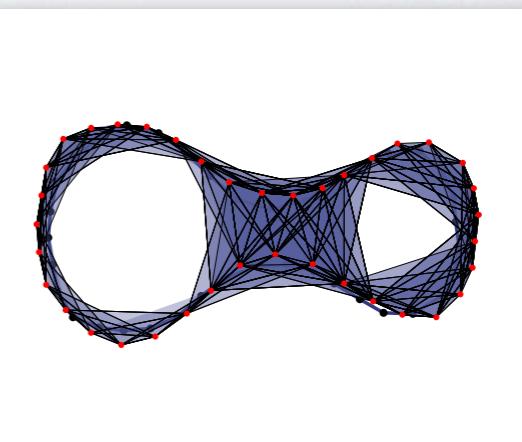
P^α



\simeq Nerve Lemma.

$\text{Čech}(P, \alpha)$

RECONSTRUCTION



Output

$R = \text{Reach } A$

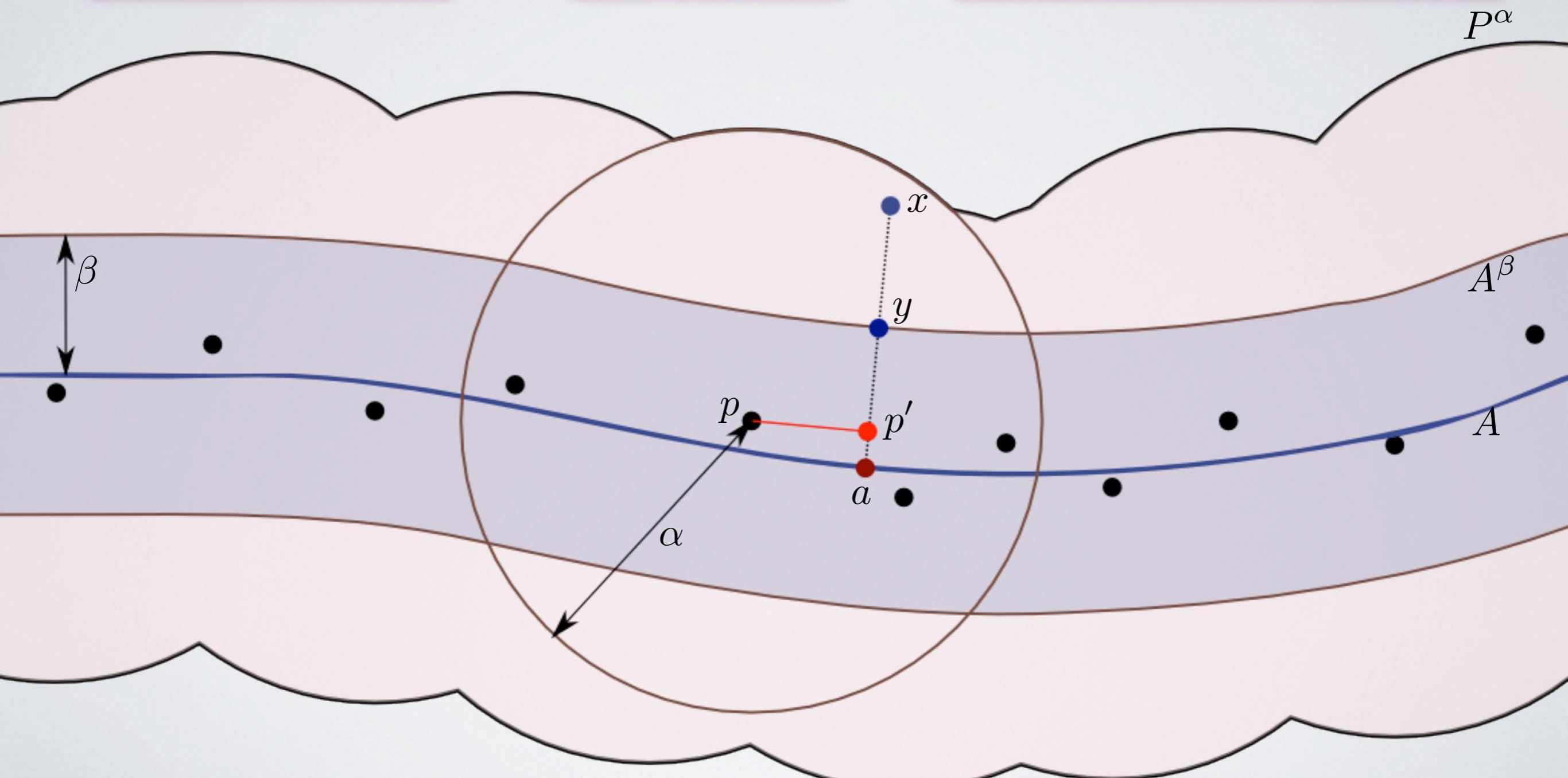
$$\beta = \sqrt{R - (R - \varepsilon)^2 - \alpha^2}$$

Short proof

$$\left. \begin{array}{l} \varepsilon < (3 - \sqrt{8})R \\ \alpha = (2 + \sqrt{2})\varepsilon \end{array} \right\} \Rightarrow$$

$$\left. \begin{array}{l} \alpha < R - \varepsilon \\ \beta < \alpha - \varepsilon \end{array} \right\} \Rightarrow$$

P^α deformation retracts to A^β

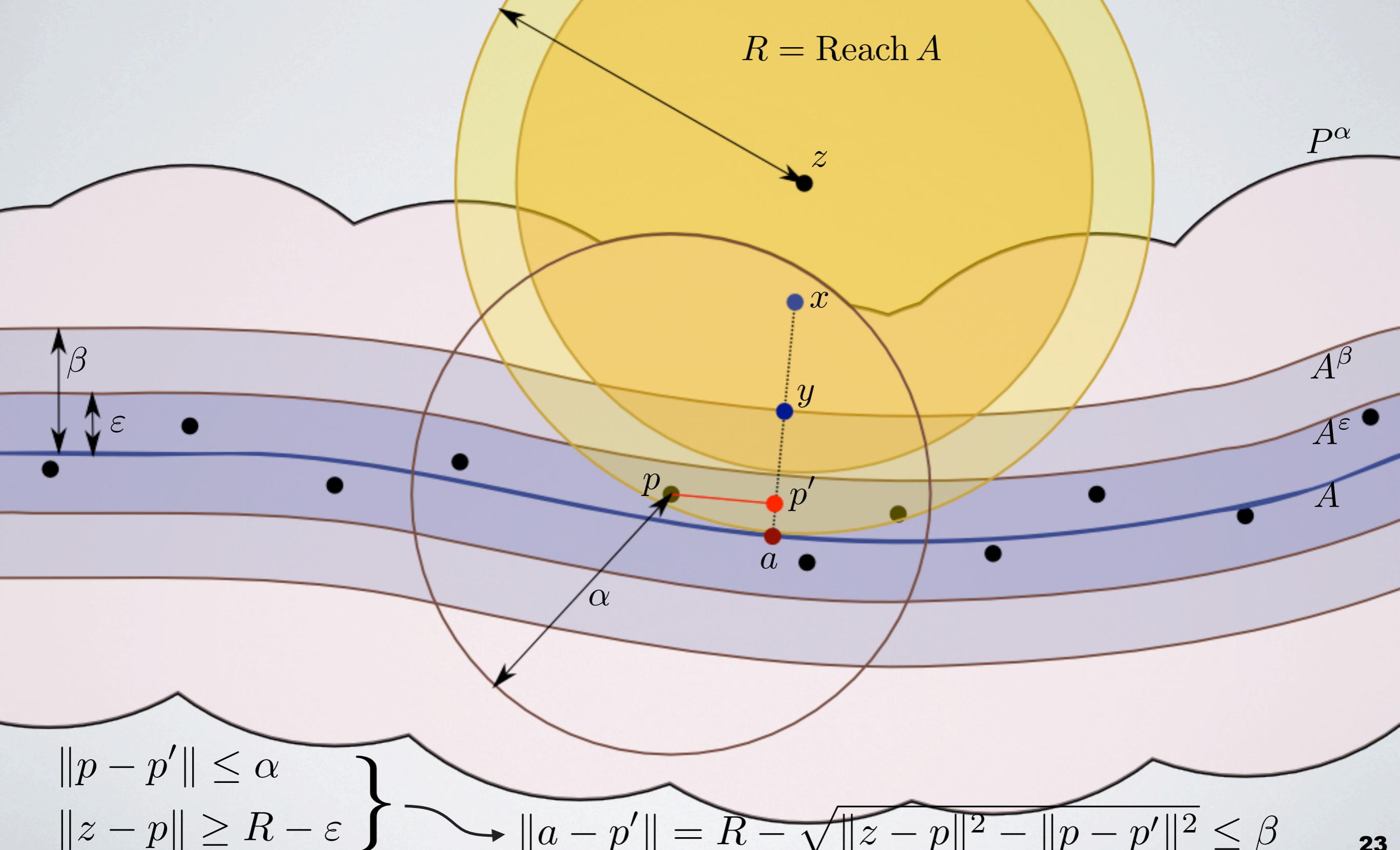


prove that $\|a - p'\| \leq \beta \implies y$ lies between x and p'

$R = \text{Reach } A$

$$\beta = \sqrt{R - (R - \varepsilon)^2 - \alpha^2}$$

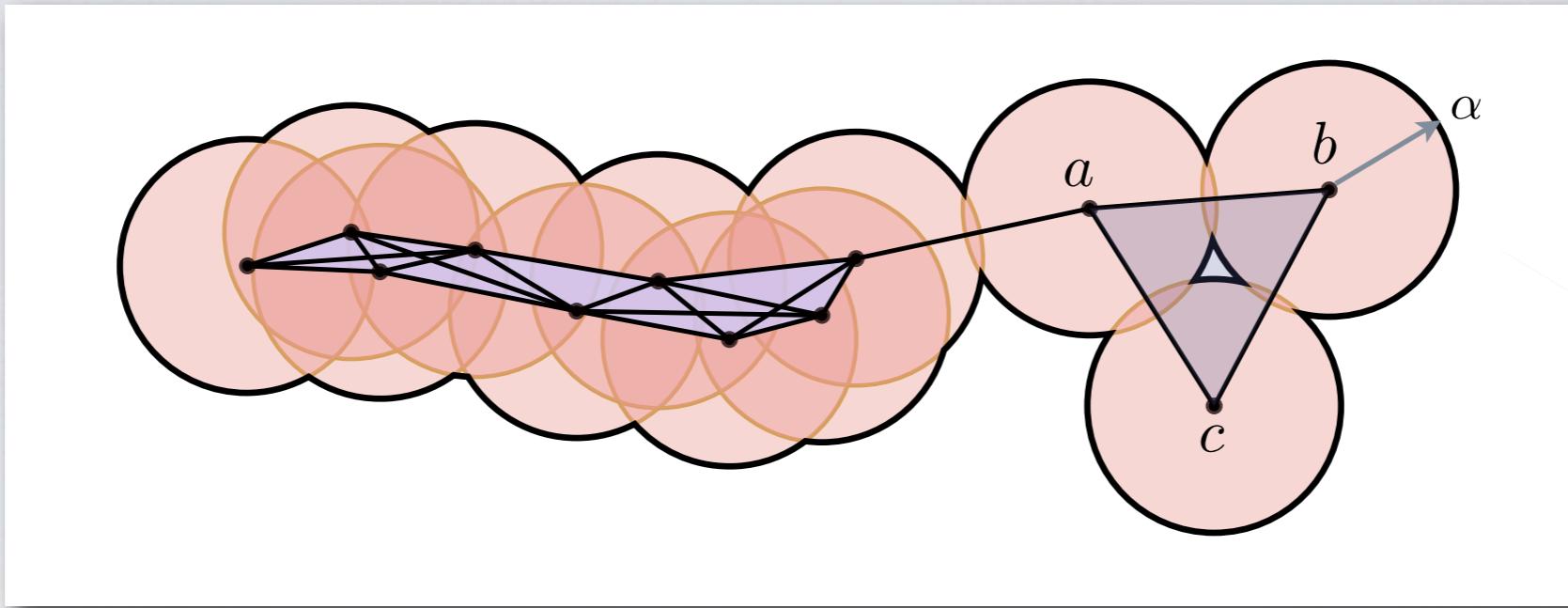
Short proof



$$\left. \begin{array}{l} \|p - p'\| \leq \alpha \\ \|z - p\| \geq R - \varepsilon \end{array} \right\}$$

$$\|z - p\| \geq R - \varepsilon \quad \left. \right\} \quad \Rightarrow \quad \|a - p'\| = R - \sqrt{\|z - p\|^2 - \|p - p'\|^2} \leq \beta$$

Rips complexes



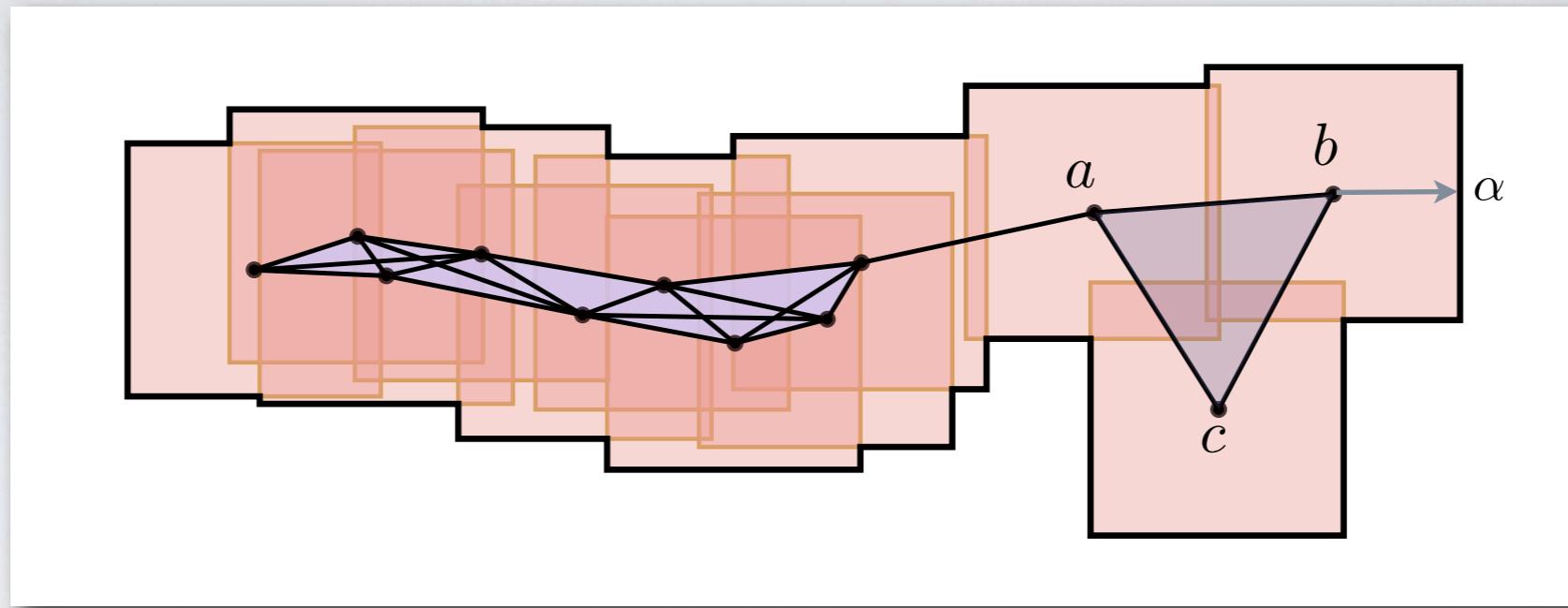
$$\text{Rips}(P, \alpha) = \{\sigma \subset P \mid \text{Diameter}(\sigma) \leq 2\alpha\}$$

$$\text{Rips}(P, \alpha) \supset \text{Cech}(P, \alpha)$$

- ✳ proximity graph G_α connects every pair of points within 2α
- ✳ $\text{Rips}(P, \alpha) = \text{Flag } G_\alpha$ [Flag G = largest complex whose 1-skeleton is G]
- ✳ compressed form of storage through the 1-skeleton
- ✳ easy to compute

Rips complexes with L_∞

When distances are measured using L_∞

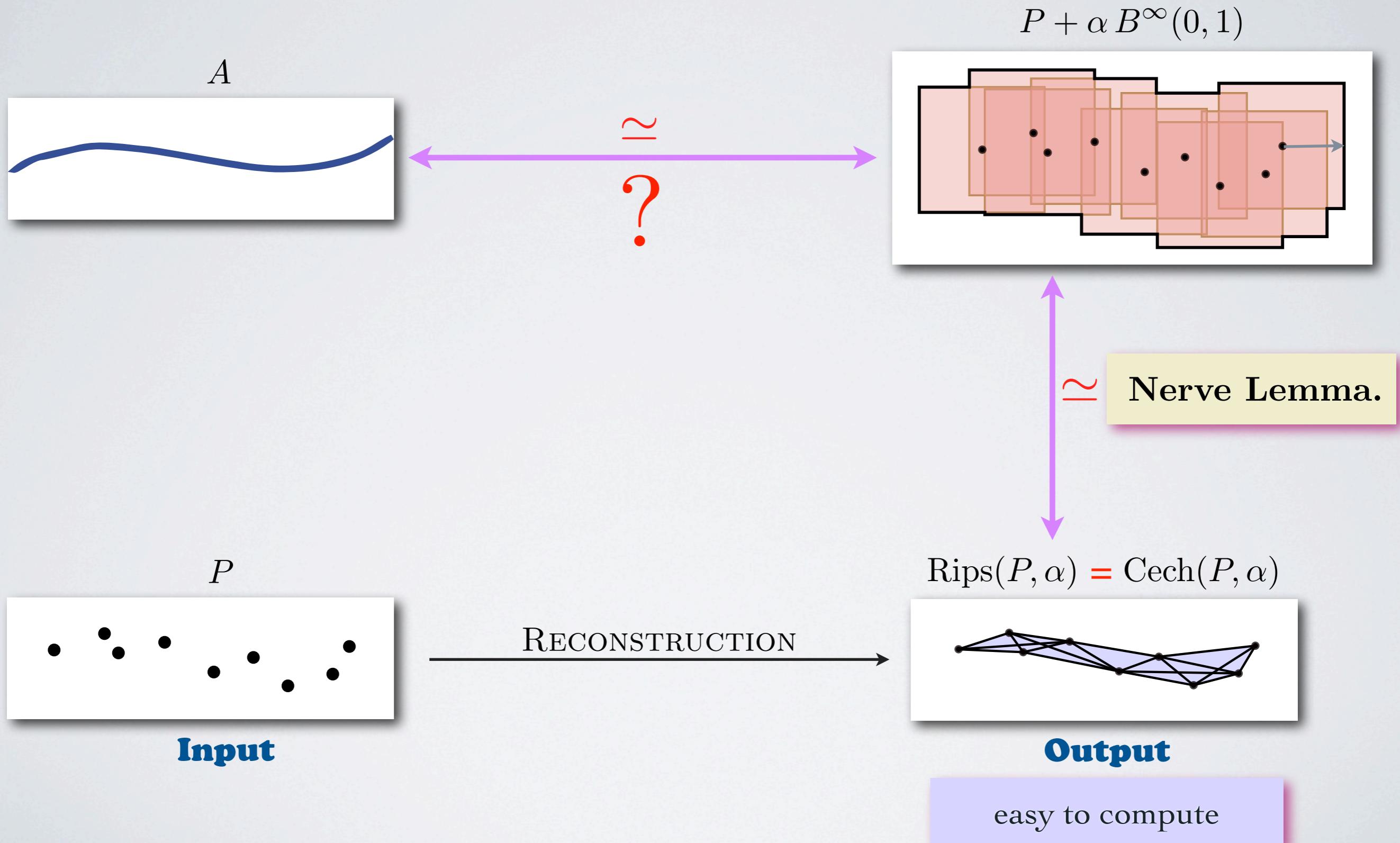


$$\text{Rips}(P, \alpha) = \{\sigma \subset P \mid \text{Diameter}(\sigma) \leq 2\alpha\}$$

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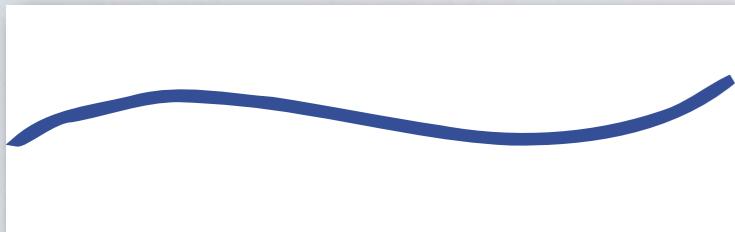
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Rips complexes with L_∞



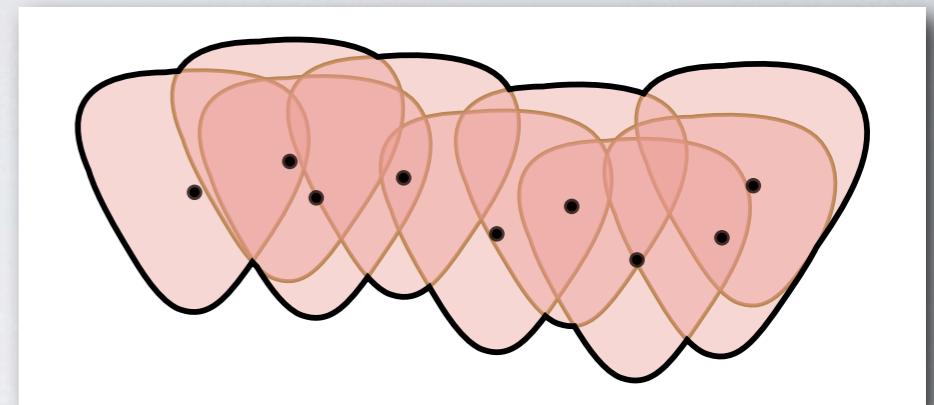
Minkowski sum

A



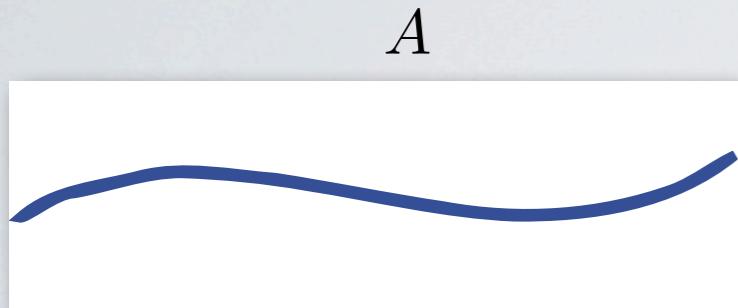
$$\xleftarrow[?]{\approx}$$

$P + \alpha C$

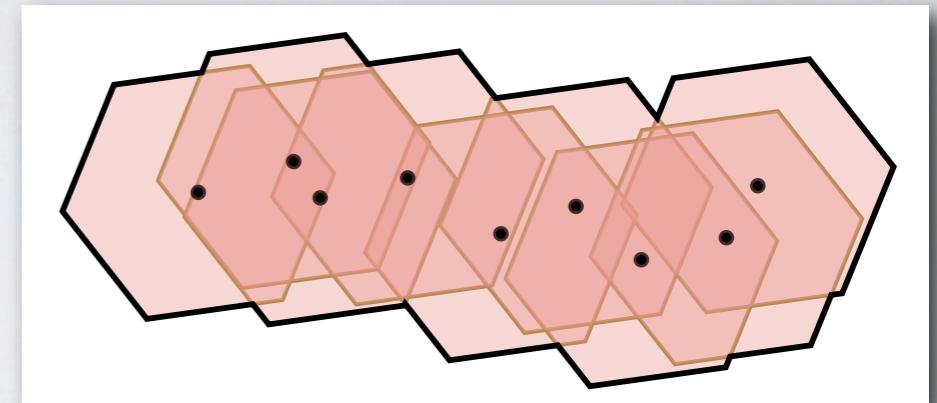


where $C =$ compact convex set

Minkowski sum

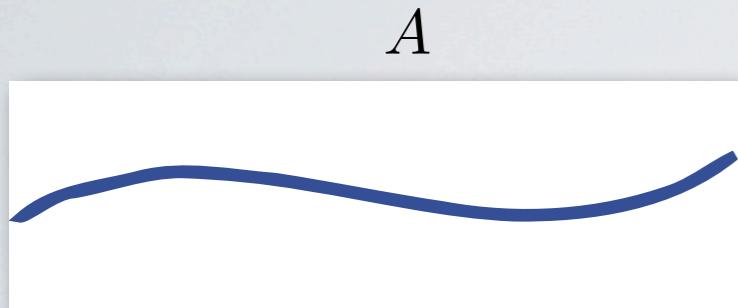


$\stackrel{\approx}{?}$

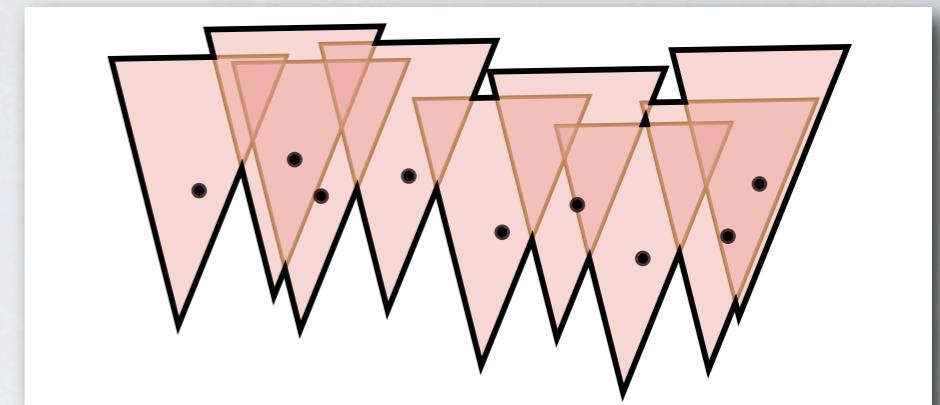


where $C =$ compact convex set

Minkowski sum



$\stackrel{\approx}{?}$



where $C =$ compact convex set

Minkowski sum

A

inclusion homotopy equivalence
 \longleftrightarrow
 if

$P + \alpha C$

$P \subset A^\varepsilon$ and $A \subset P + \varepsilon C$

and

$\frac{\varepsilon}{\text{Reach } A}$ small enough

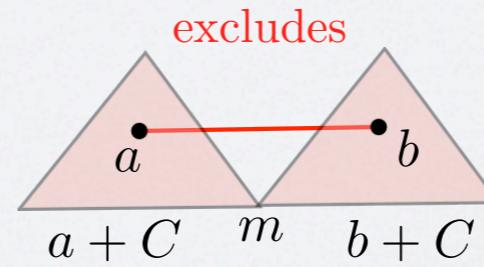
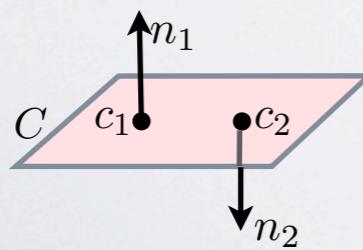
and

$$\frac{\alpha}{\varepsilon} = \frac{4}{1 - \xi}$$

where C compact convex set that satisfies:

- (i) $B(0, 1) \subset C \subset \delta B(0, 1)$ for some $\delta \geq 1$; (“distortion” to unit ball)
- (ii) C is (θ, \varkappa) -round for $\theta = \arccos(-\frac{1}{d})$ and $\varkappa > 0$; (“curvature”)
- (iii) C is ξ -eccentric for $\xi < 1$. (“distance” between $\bigcap_{q \in Q}(q + C)$ and $\text{Hull}(Q)$)

excludes



Minkowski sum

A

inclusion homotopy equivalence
 if

$P + \alpha C$

$P \subset A^\varepsilon$ and $A \subset P + \varepsilon C$

and

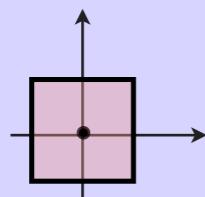
$\frac{\varepsilon}{\text{Reach } A}$ small enough

and

$$\frac{\alpha}{\varepsilon} = \frac{4}{1-\xi}$$

① d -balls satisfy (i) (ii) and (iii) for $\delta = 1$, $\varkappa = 1$ and $\xi = 0$.

② d -cubes satisfy (i) (ii) and (iii) for $\delta = \sqrt{d}$



$$\varkappa = \begin{cases} \frac{1}{2\sqrt{2}} (\cos \frac{\pi}{4} + \cos \frac{\pi}{12}) & \text{if } d = 2, \\ \frac{1}{\sqrt{6}} & \text{if } d = 3, \\ \frac{1}{(d-2)\sqrt{d}} & \text{if } d \geq 4, \end{cases}$$

$$\xi = 1 - \frac{2}{d}$$

Minkowski sum

A

inclusion homotopy equivalence
 if

$P + \alpha C$

$P \subset A^\varepsilon$ and $A \subset P + \varepsilon C$

and

$$\frac{\varepsilon}{\text{Reach } A} < \lambda$$

and

$$\frac{\alpha}{\varepsilon} = \eta$$

Admissible values of ε and α are solutions of a system of equations that depends upon (δ, κ, ξ) .

C	d	λ	η
d -ball with [NSW04]	$\forall d$	$3 - \sqrt{8} \approx 0.17$	$2 + \sqrt{2} \approx 3.41$
d -ball with this proof	$\forall d$	0.077	3.96
d -cube	2	0.04	4.04
	3	0.01	6.14
	4	0.004	8.18
	5	0.002	10.2
	10	0.0002	20.23
[Rips(P, α) with ℓ_∞]	100	0.0000002	200.23

What now?

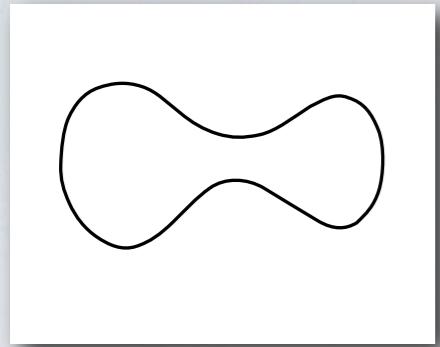
- ★ The largest ratio $\frac{\varepsilon}{\text{Reach } A}$ that we get for $\text{Rips}(P, \alpha)$ with ℓ_∞ :
 - ★ Decreases quickly with d
 - ★ Is it tight?



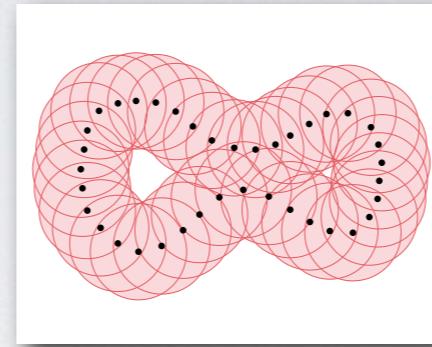
$\ell_\infty \rightarrow \ell_2$

Rips complexes with L_2

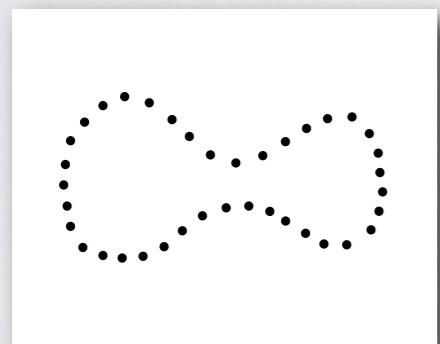
A



P^α

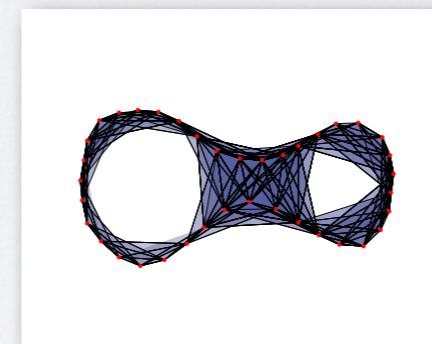


P



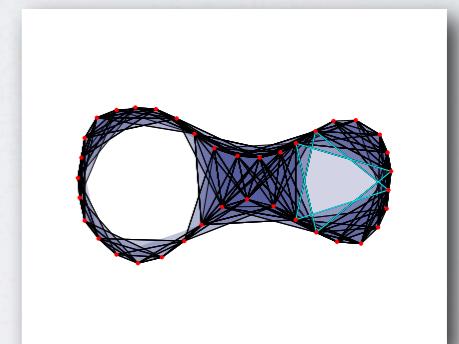
Input

$\text{Cech}(P, \alpha)$



\subset

$\text{Rips}(P, \alpha)$

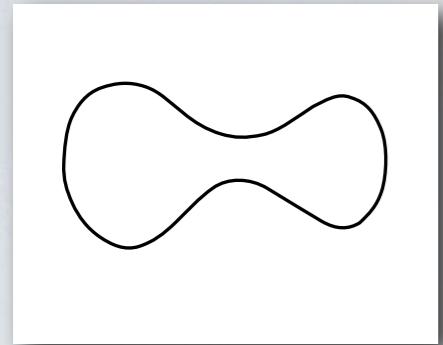


Output

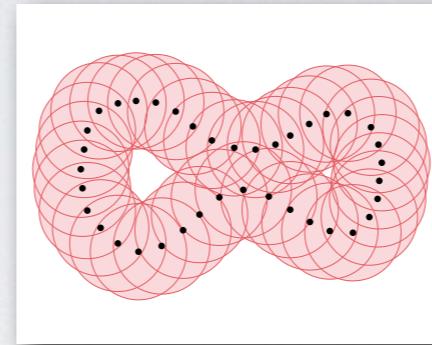
easy to compute

Rips complexes with L_2

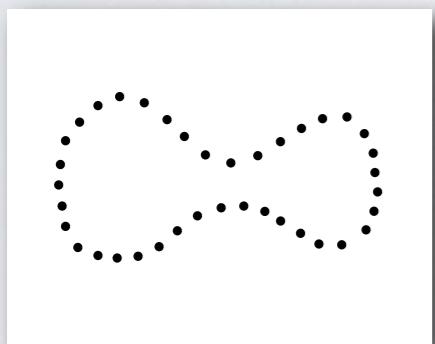
A



P^α

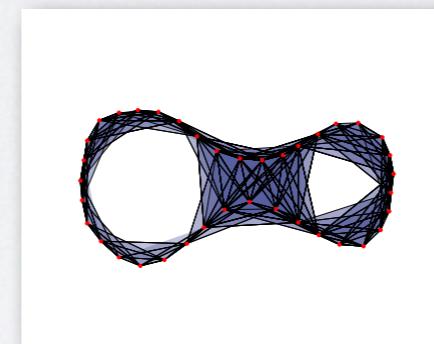


P



Input

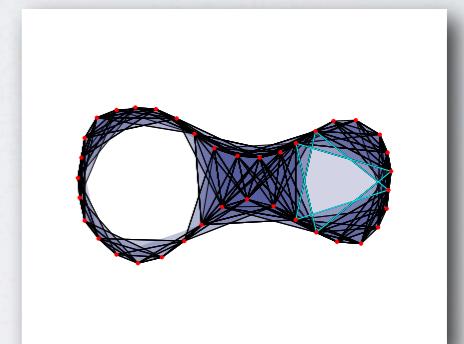
$\text{Cech}(P, \alpha)$



\simeq Nerve Lemma

\subset

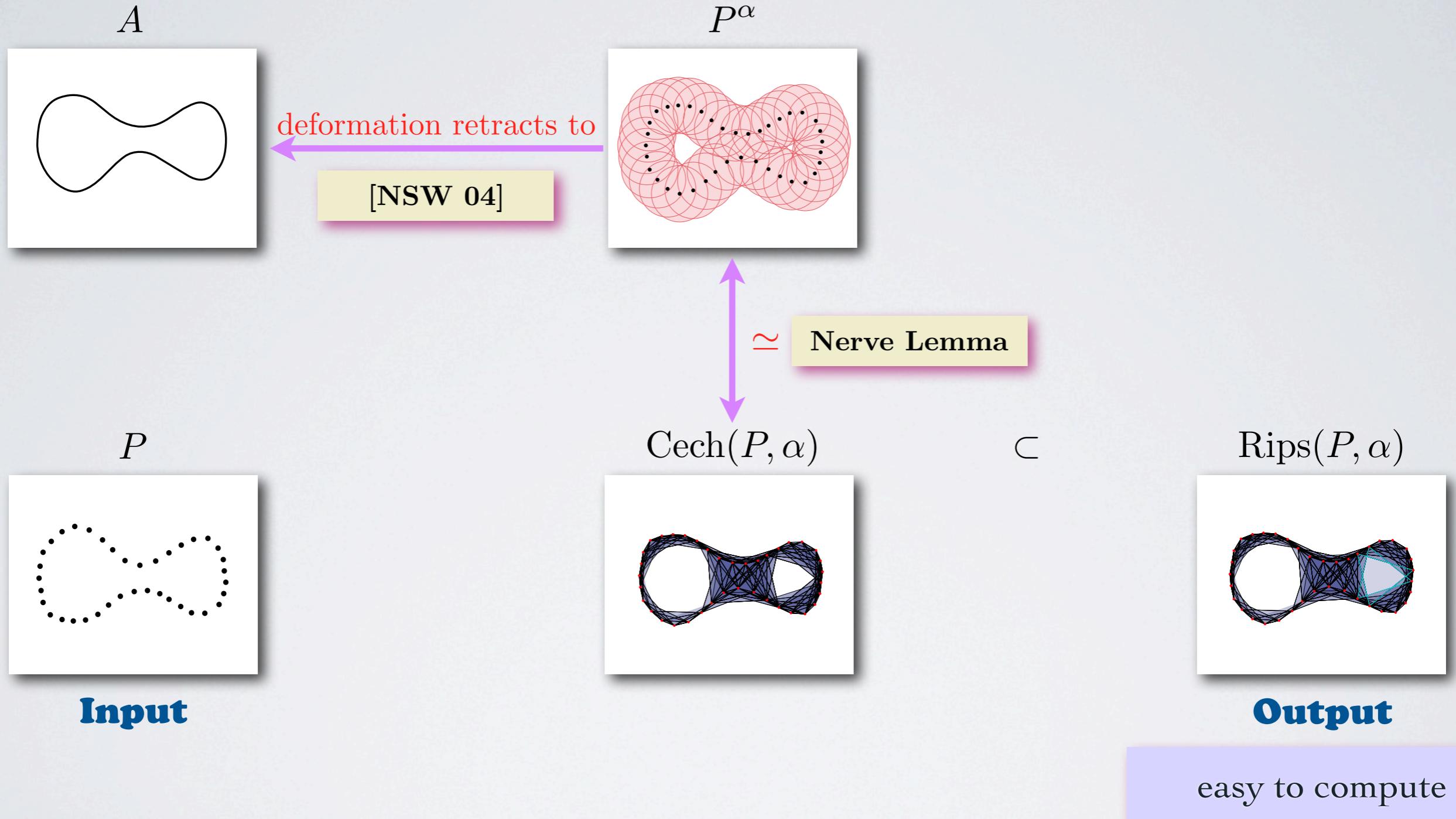
$\text{Rips}(P, \alpha)$



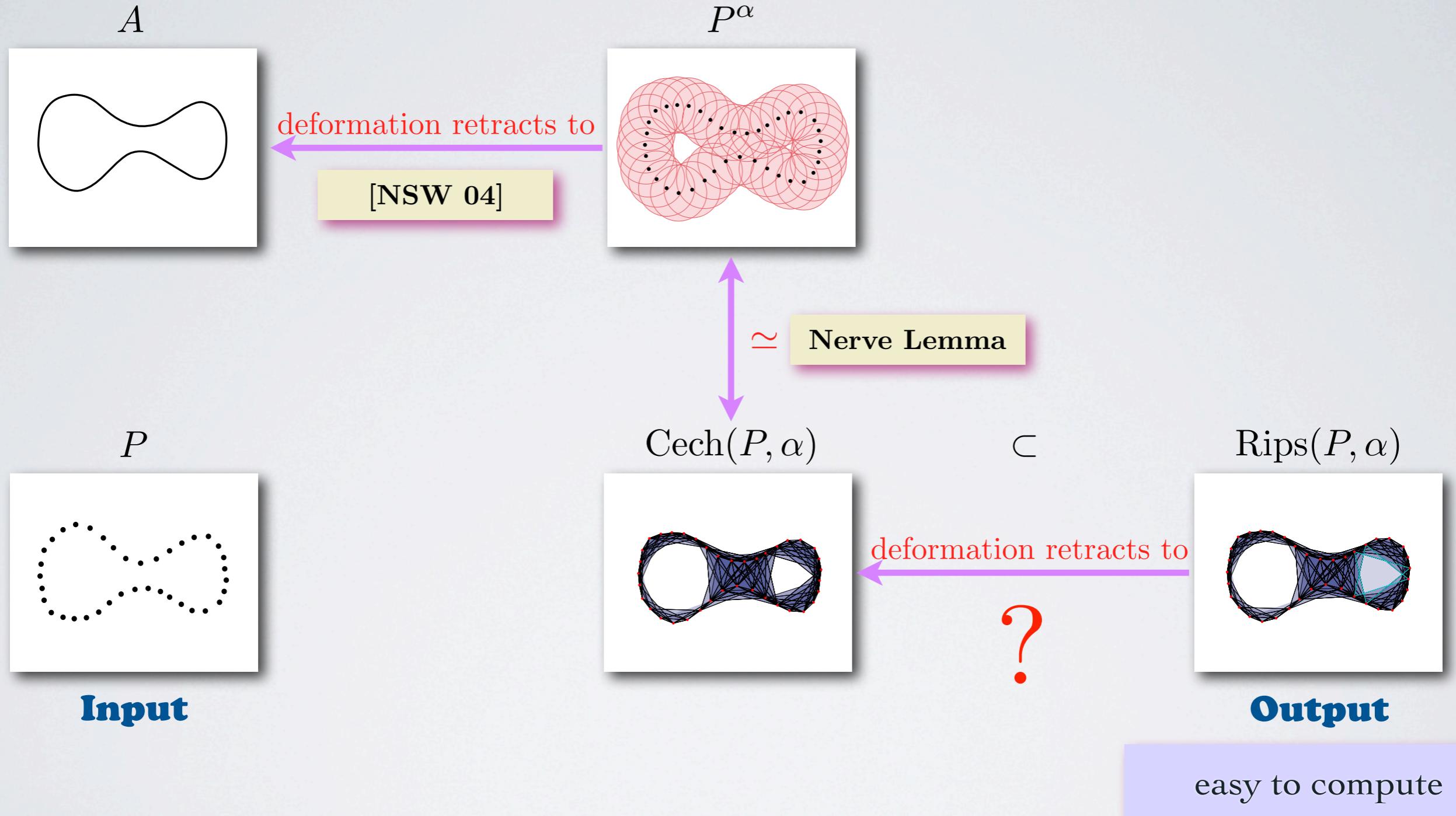
Output

easy to compute

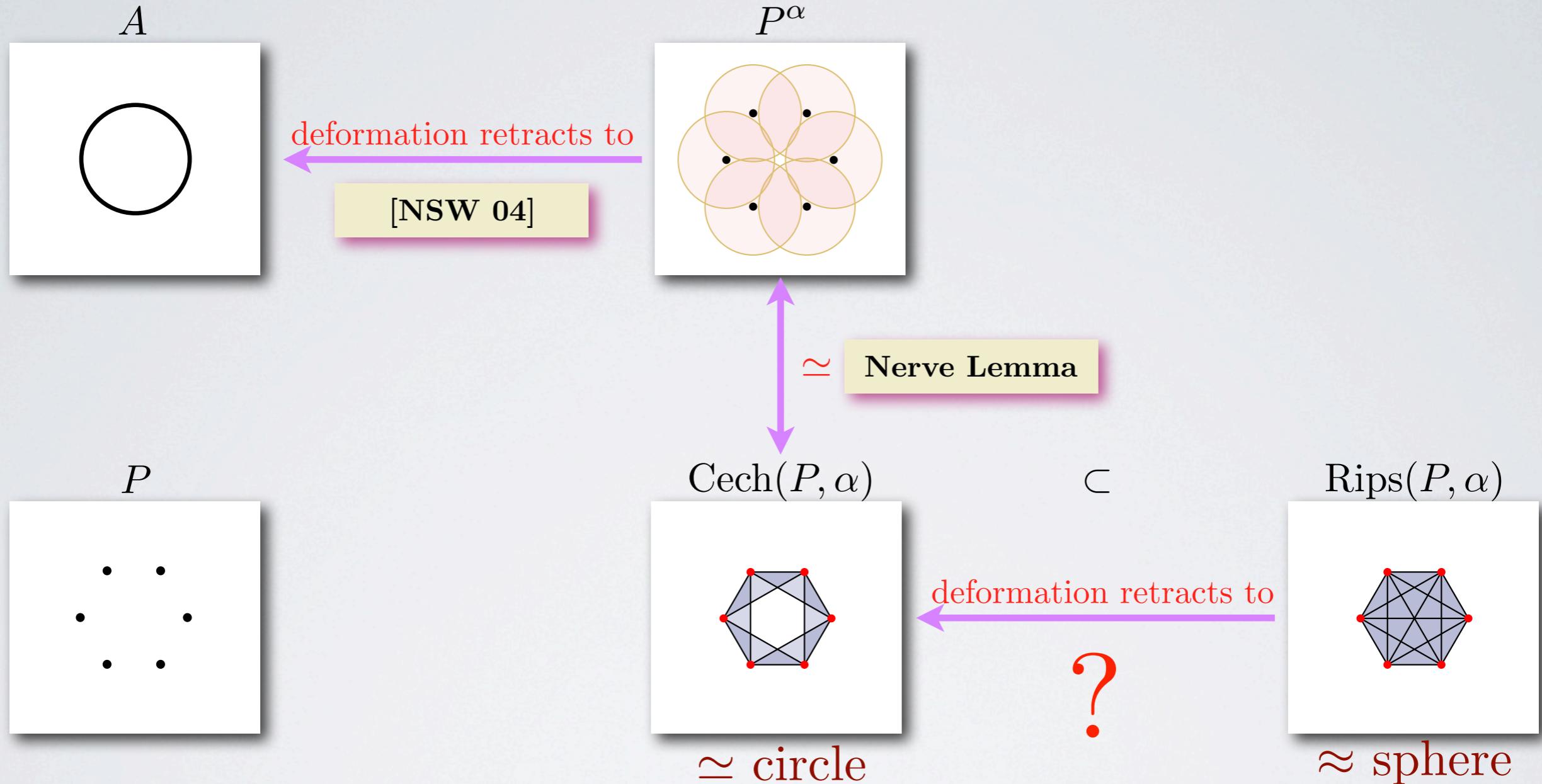
Rips complexes with L_2



Rips complexes with L_2



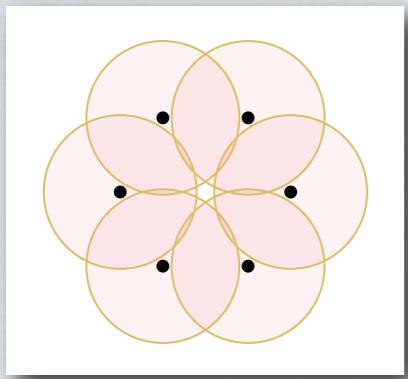
Rips complexes with L_2



Rips and Čech complexes generally don't share the same topology, but ...

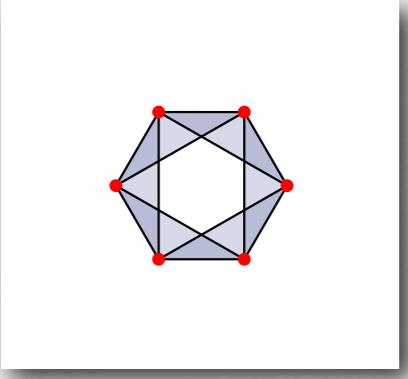
Roadmap

P^α



\approx

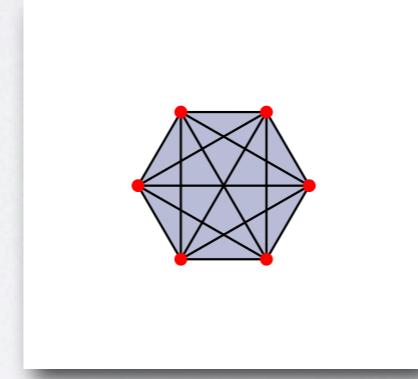
$\text{Cech}(P, \alpha)$



\simeq circle

\subset

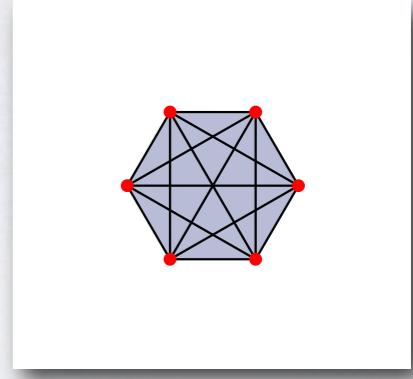
$\text{Rips}(P, \alpha)$



\approx sphere

\subset

$\text{Cech}(P, \vartheta_d \alpha)$

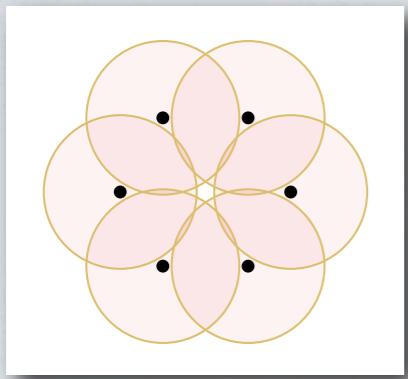


\approx 5-ball

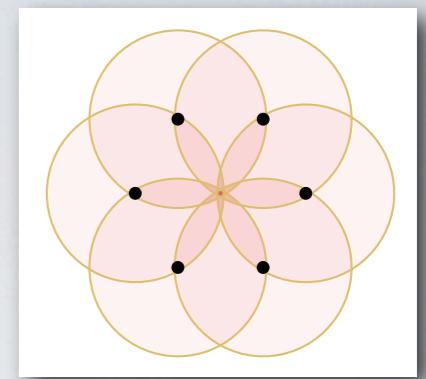
for $\vartheta_d = \sqrt{\frac{2d}{d+1}}$

Roadmap

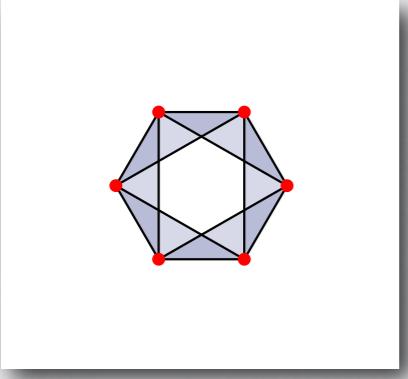
P^α



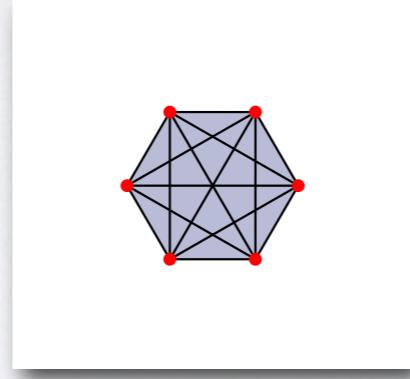
$P^{\vartheta_d \alpha}$



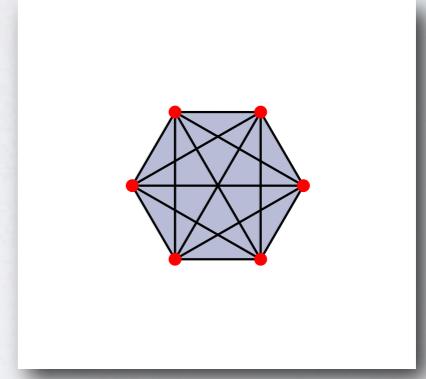
$\text{Cech}(P, \alpha)$



$\text{Rips}(P, \alpha)$



$\text{Cech}(P, \vartheta_d \alpha)$



i

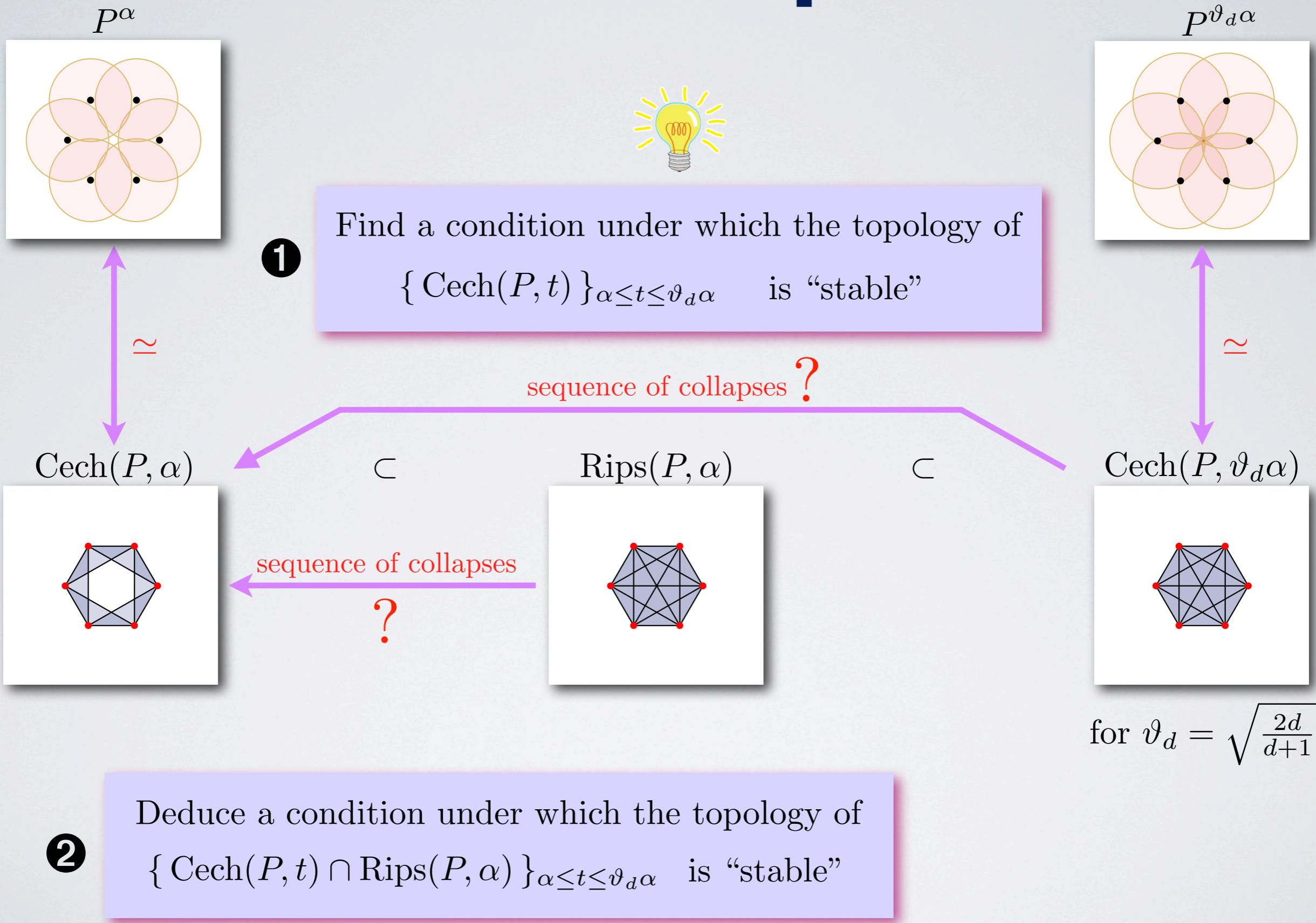
Find a condition under which the topology of
 $\{ \text{Cech}(P, t) \}_{\alpha \leq t \leq \vartheta_d \alpha}$ is “stable”



sequence of collapses ?

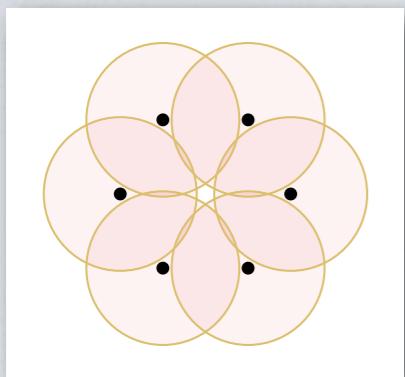
for $\vartheta_d = \sqrt{\frac{2d}{d+1}}$

Roadmap

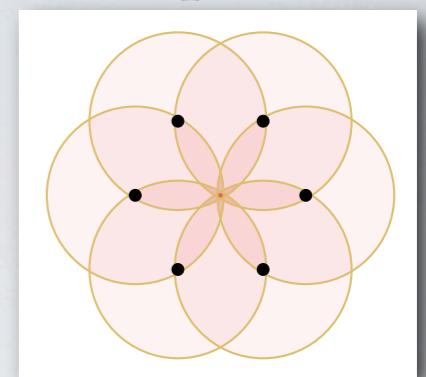


Roadmap

P^α



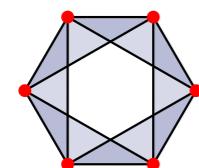
$P^{\vartheta_d \alpha}$



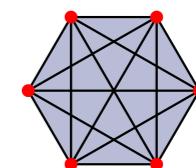
deformation retracts to
?

\simeq
 $\text{Cech}(P, \alpha)$

Find a condition under which the topology of
 $\{ \text{Cech}(P, t) \}_{\alpha \leq t \leq \vartheta_d \alpha}$ is “stable”



\simeq
 $\text{Cech}(P, \vartheta_d \alpha)$



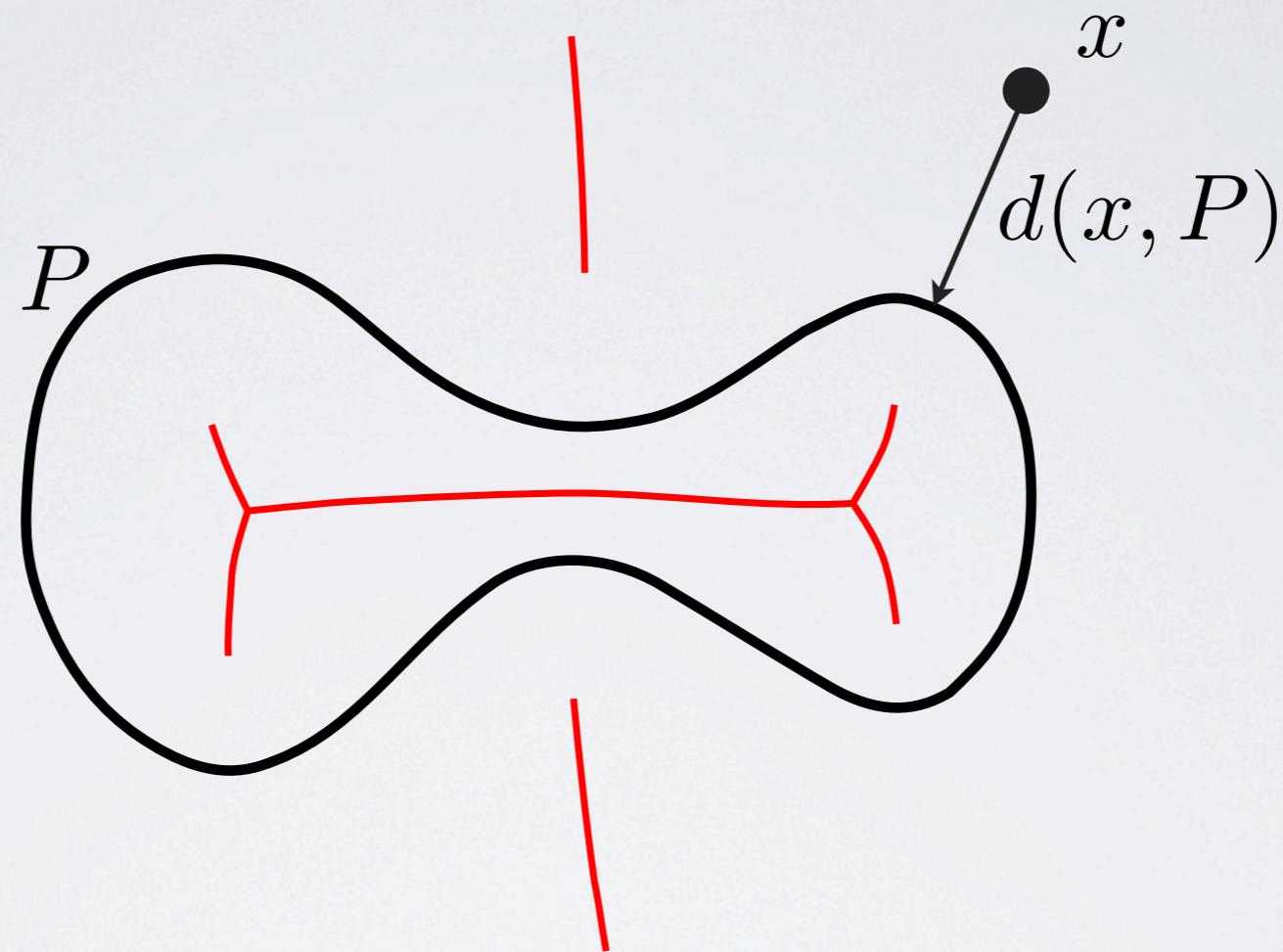
\simeq circle

sequence of collapses
?

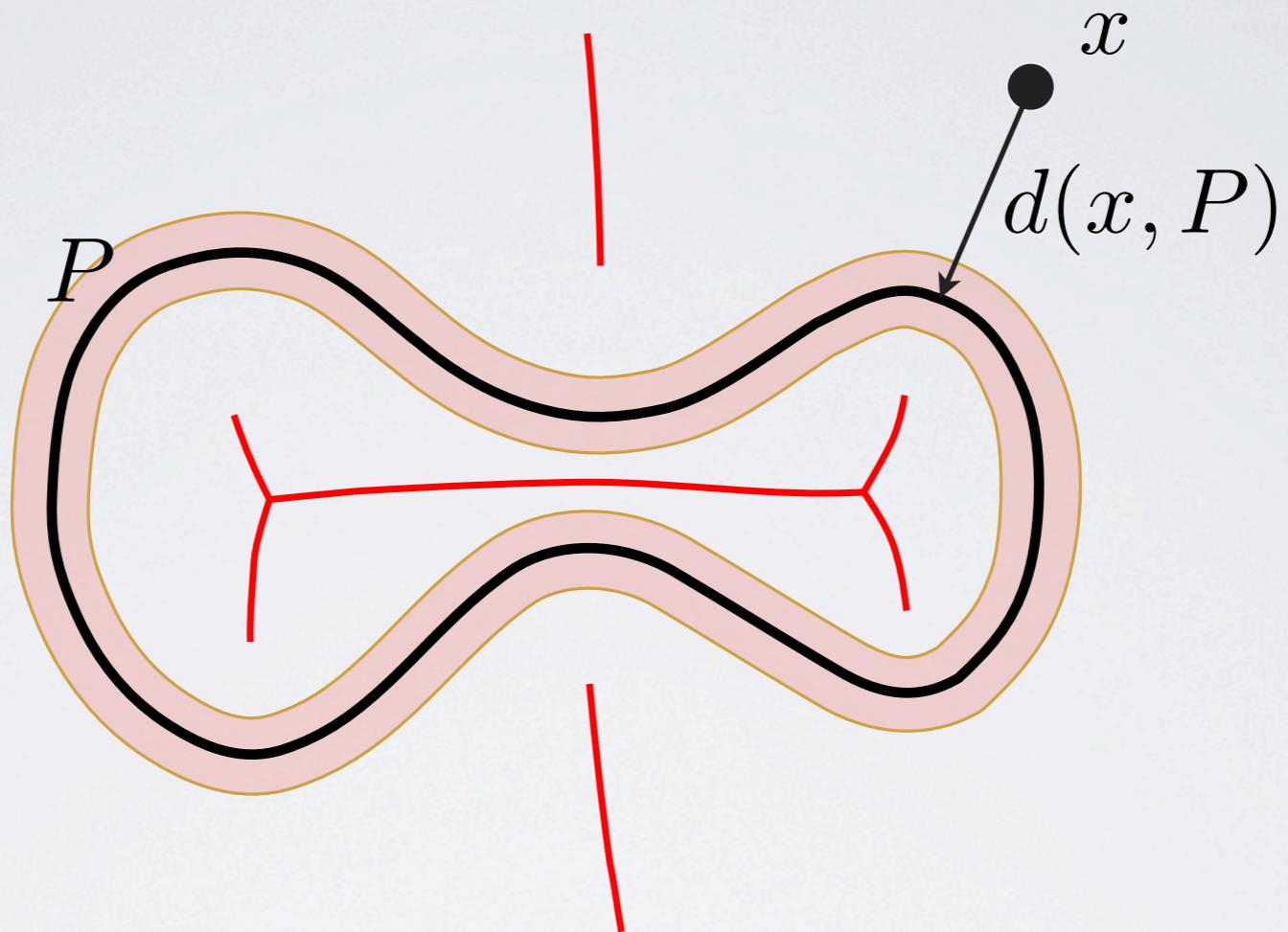
\approx 5-ball

for $\vartheta_d = \sqrt{\frac{2d}{d+1}}$

Distance function

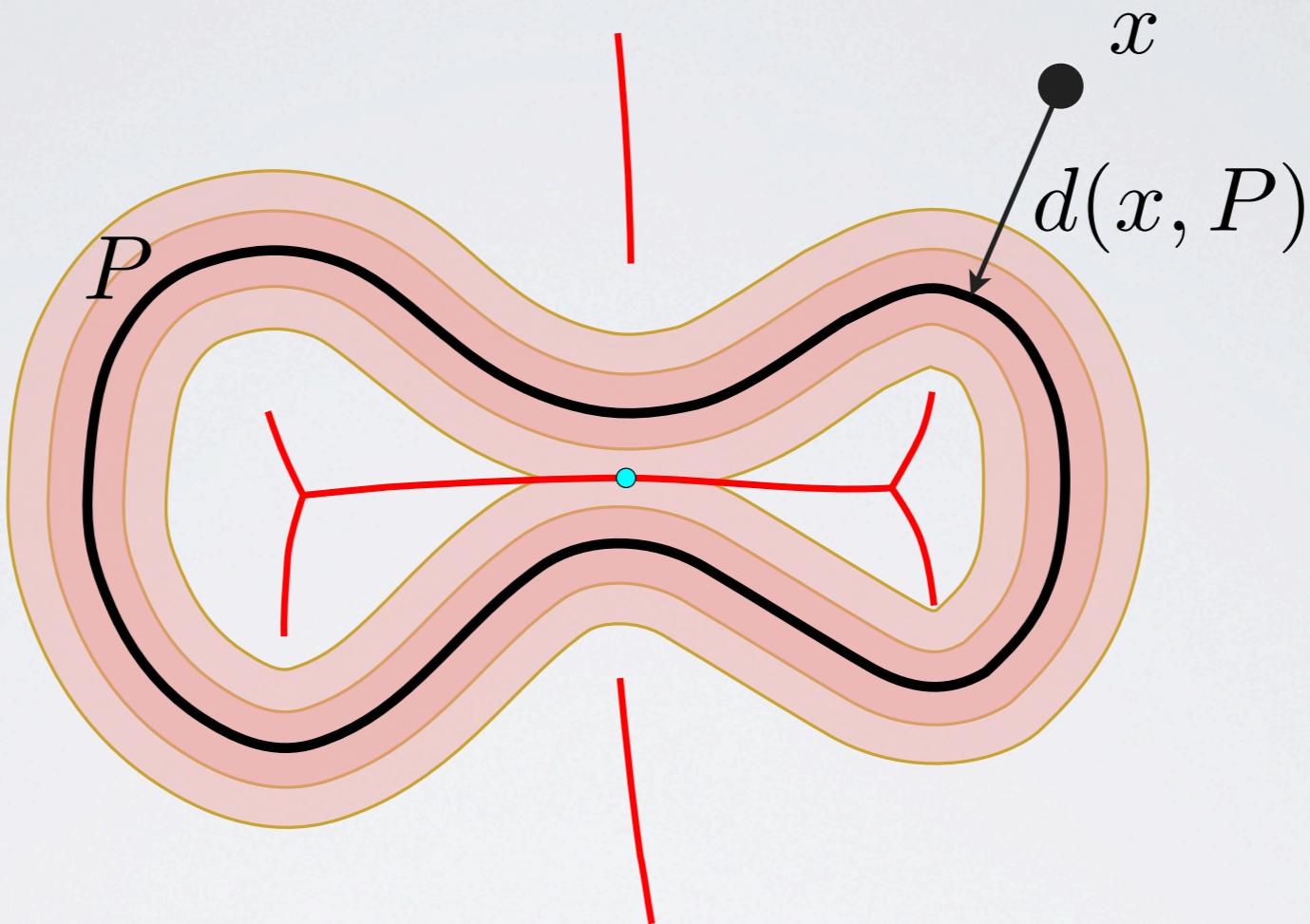


Distance function



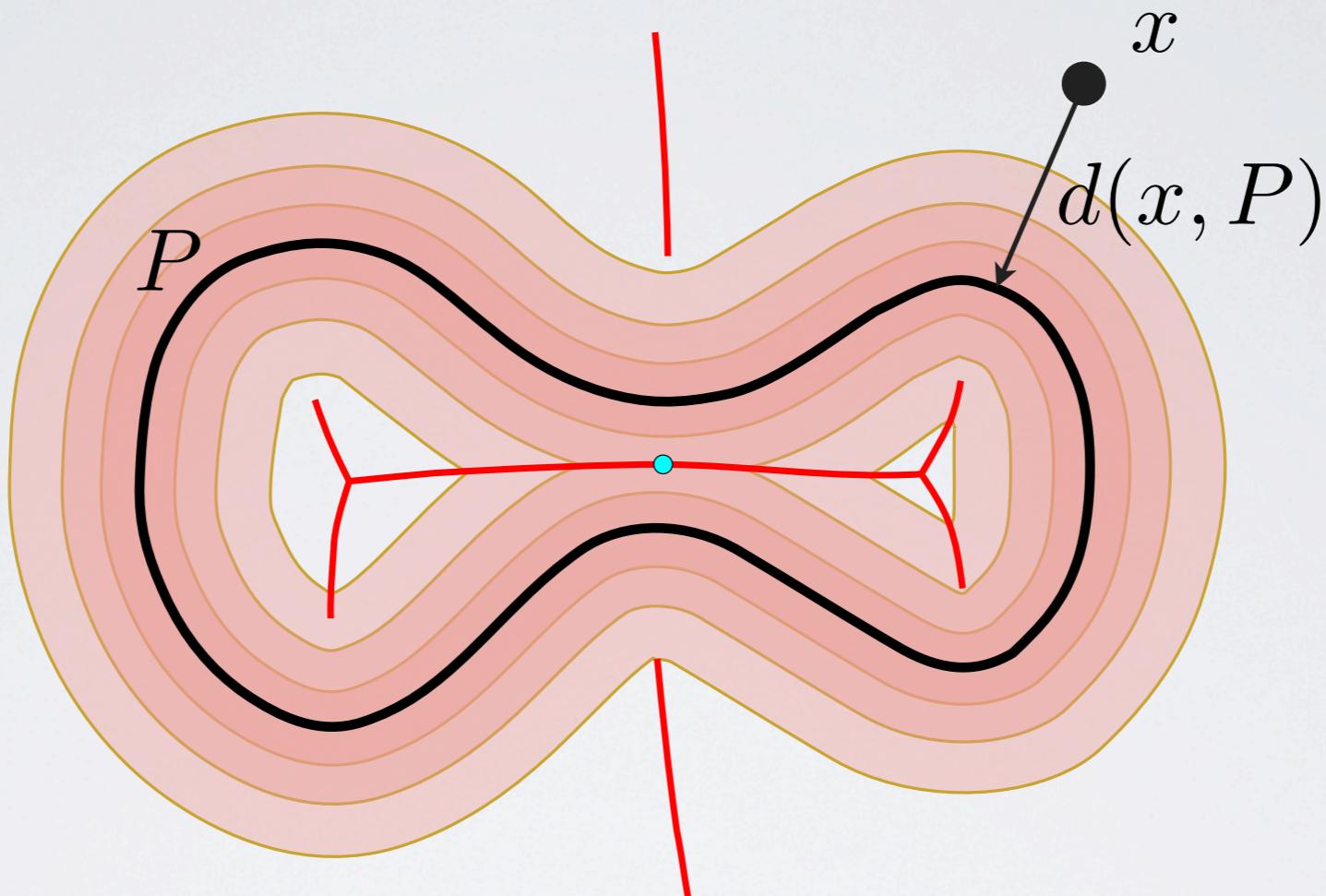
- ★ Sublevel sets of $d(\cdot, P)$ are offsets of P .

Distance function



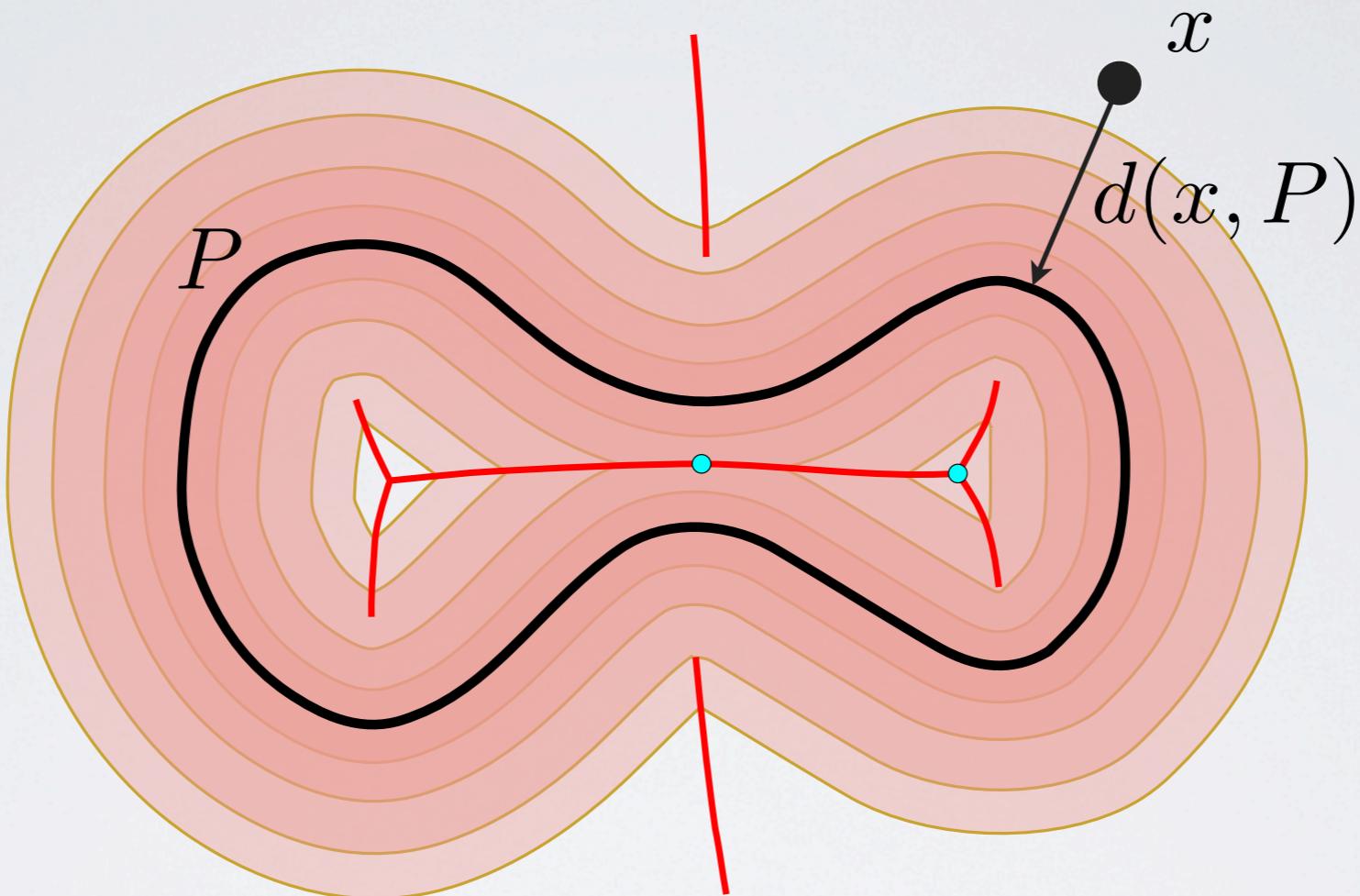
- ✳ Sublevel sets of $d(\cdot, P)$ are offsets of P .
- ✳ Topology of sublevel sets changes at critical values t_0 .

Distance function



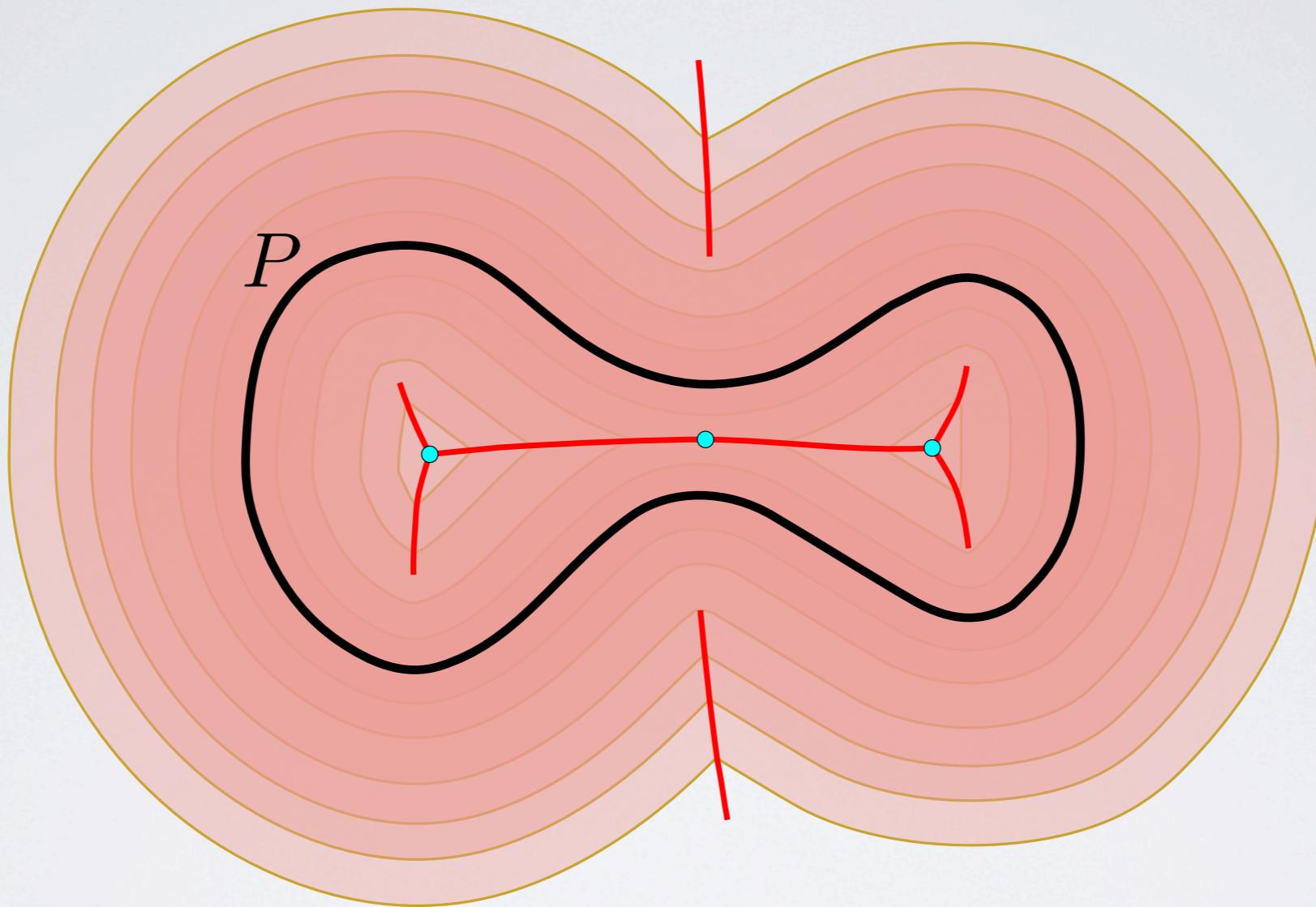
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Distance function



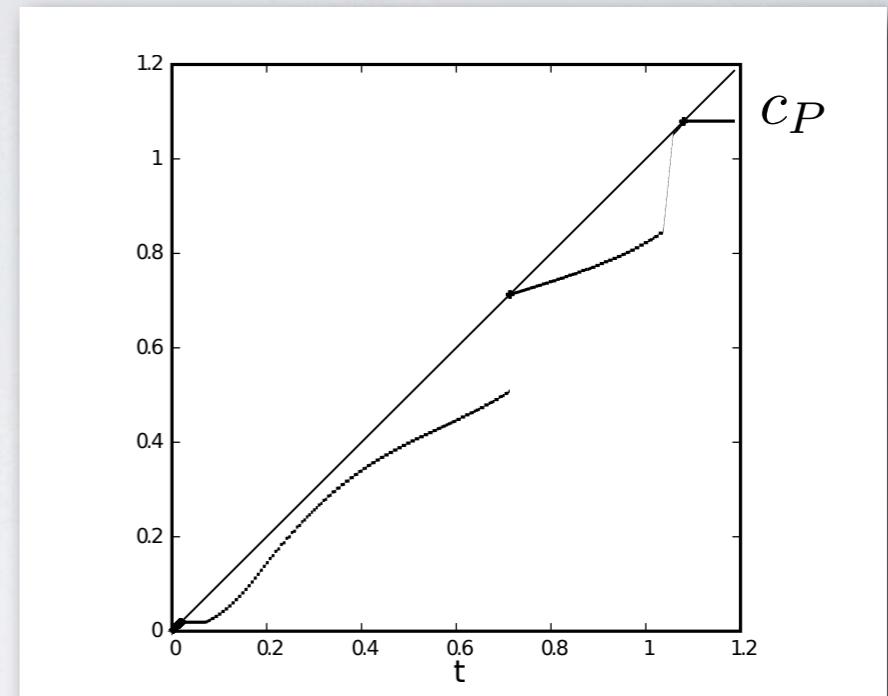
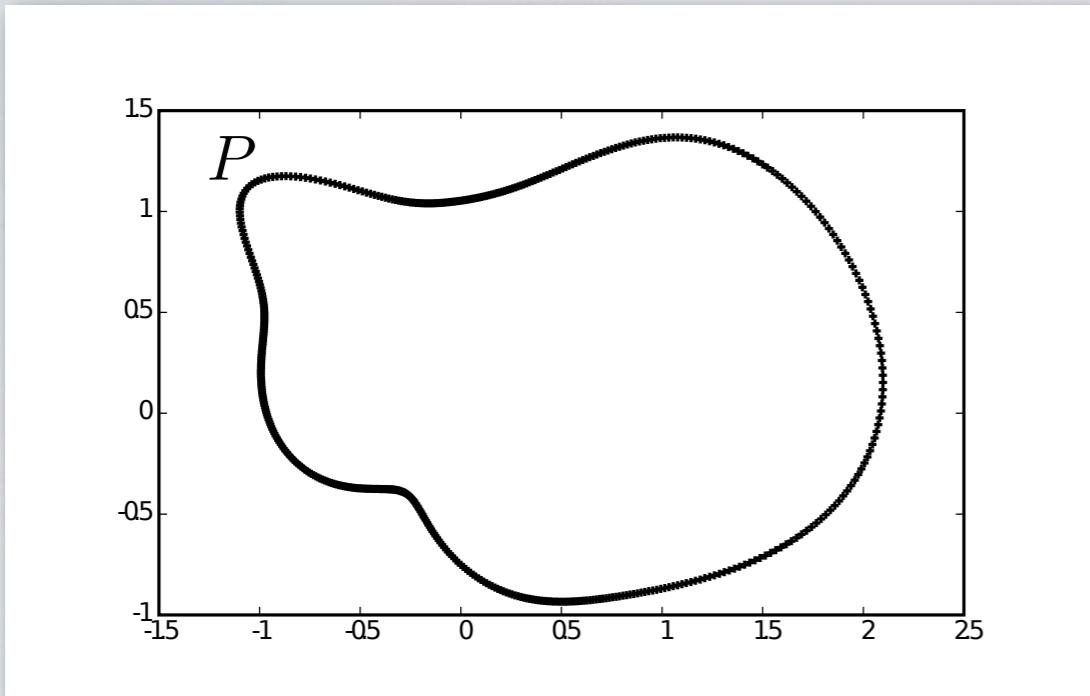
- ✳ Sublevel sets of $d(\cdot, P)$ are offsets of P .
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Distance function



- ✳ Sublevel sets of $d(\cdot, P)$ are offsets of P .
- ✳ Topology of sublevel sets changes at critical values t_0 .
- ✳ t_0 critical value $\iff c_P(t_0) = t_0$

Convexity defects

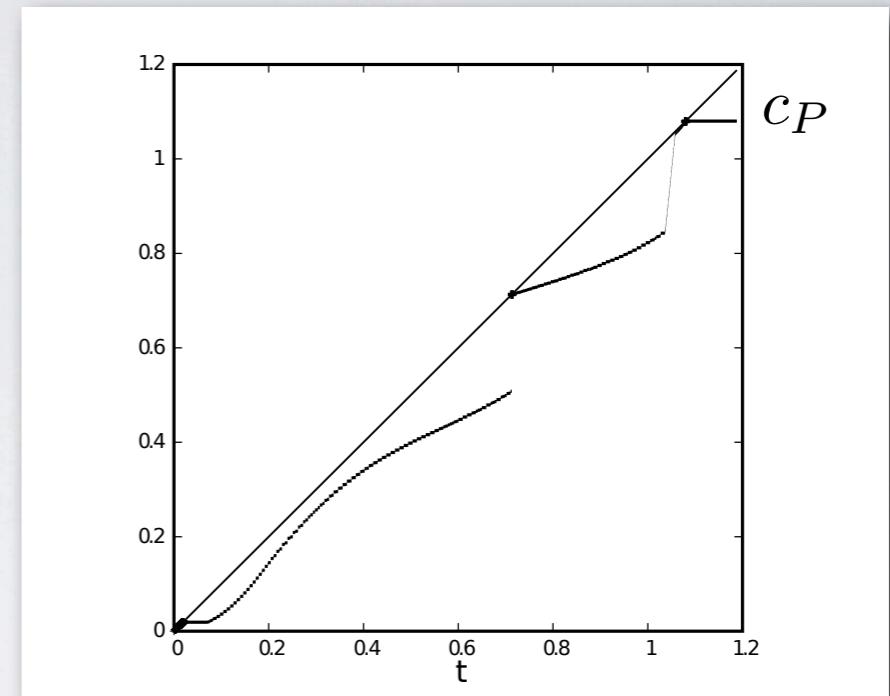
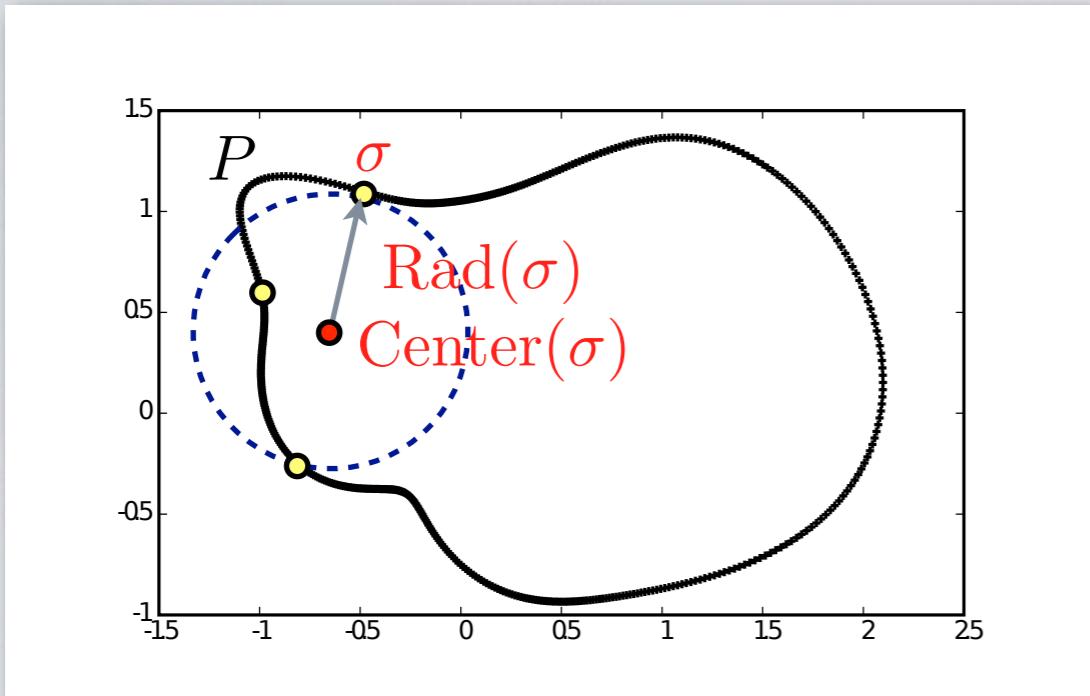


$$\text{Centers}(P, t) = \bigcup_{\substack{\emptyset \neq \sigma \subset P \\ \text{Rad}(\sigma) \leq t}} \{\text{Center}(\sigma)\}.$$

$$c_P(t) = d_H(\text{Centers}(P, t) \mid P)$$

- ★ For a compact set P : P convex $\iff c_P = 0$
- ★ c_P non decreasing
- ★ $c_P(t) \leq t$
- ★ $c_P(t) = t \iff t$ critical value $d(\cdot, P)$

Convexity defects

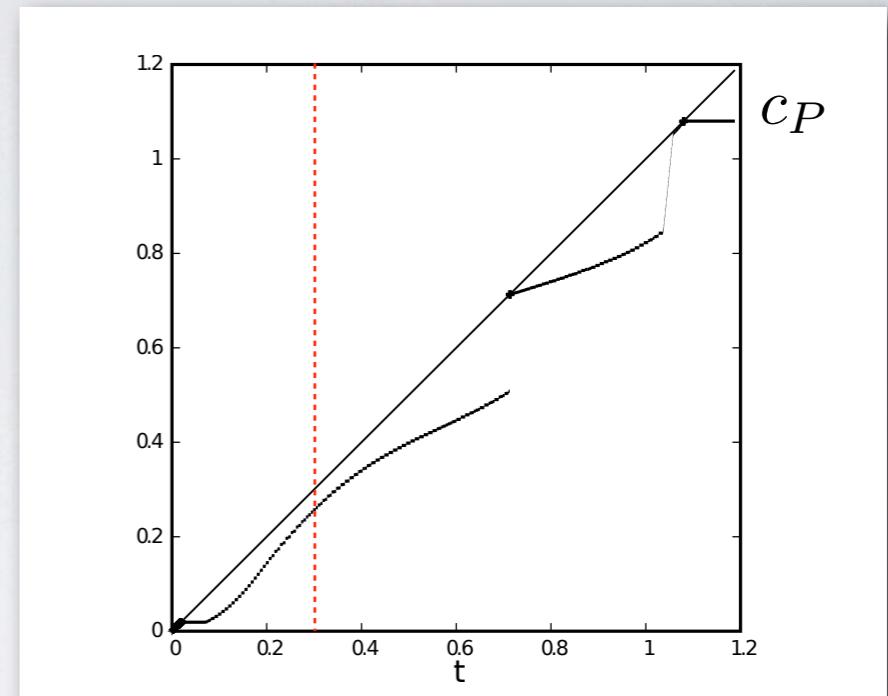
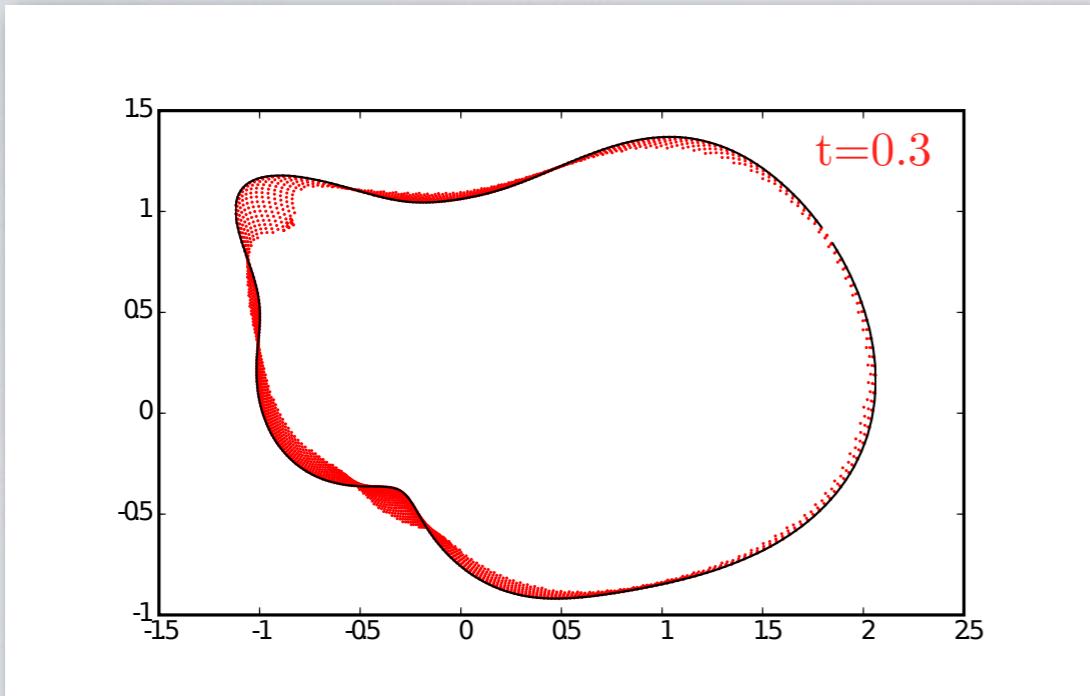


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Convexity defects

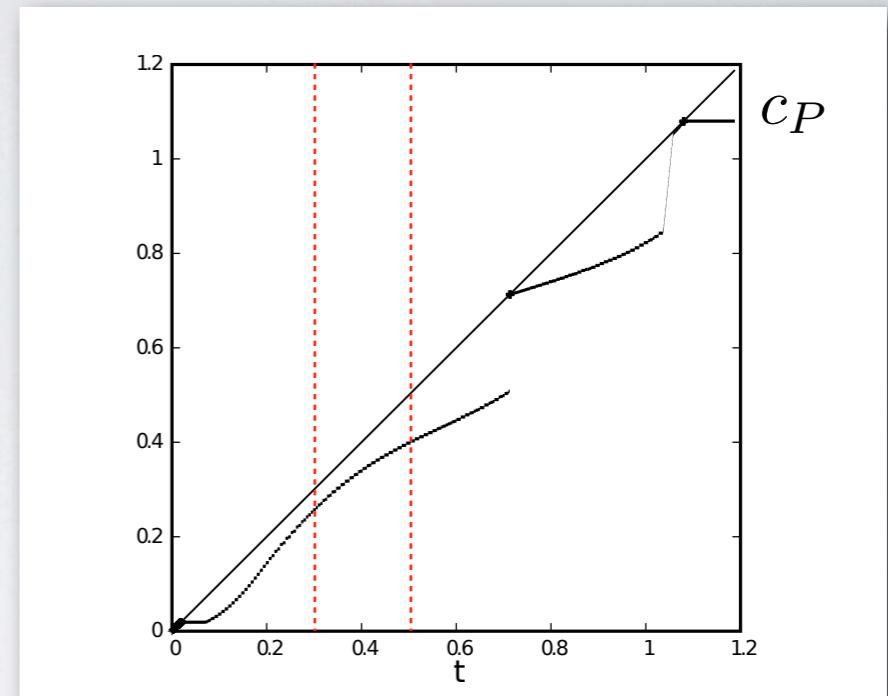
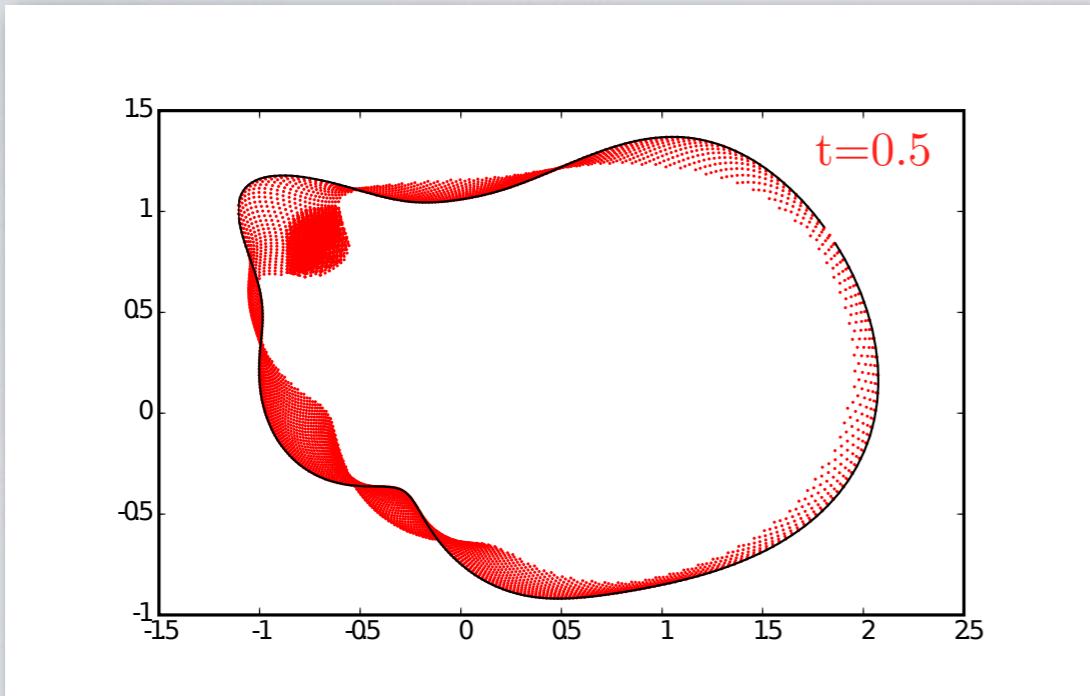


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Convexity defects

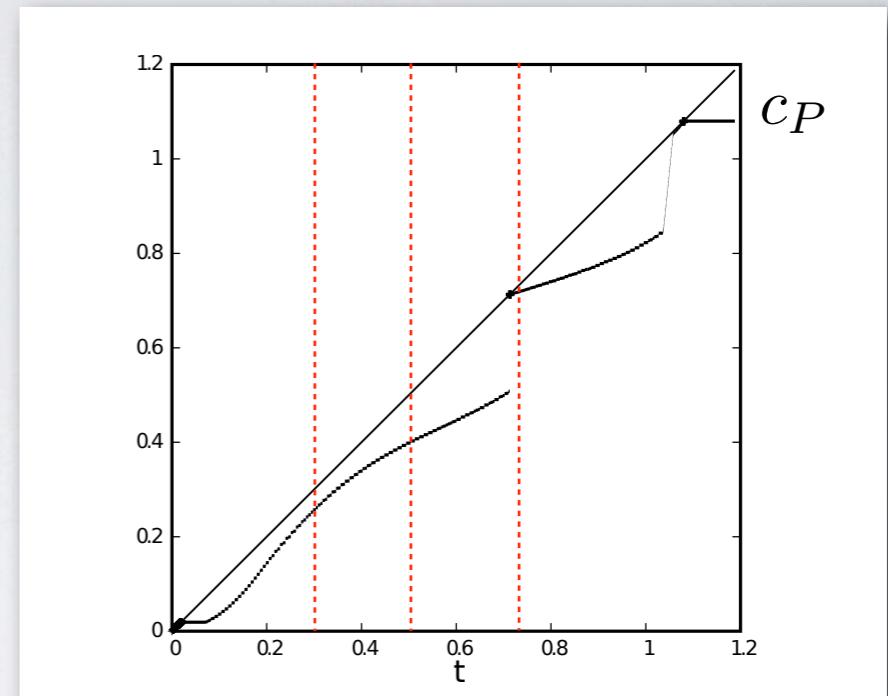
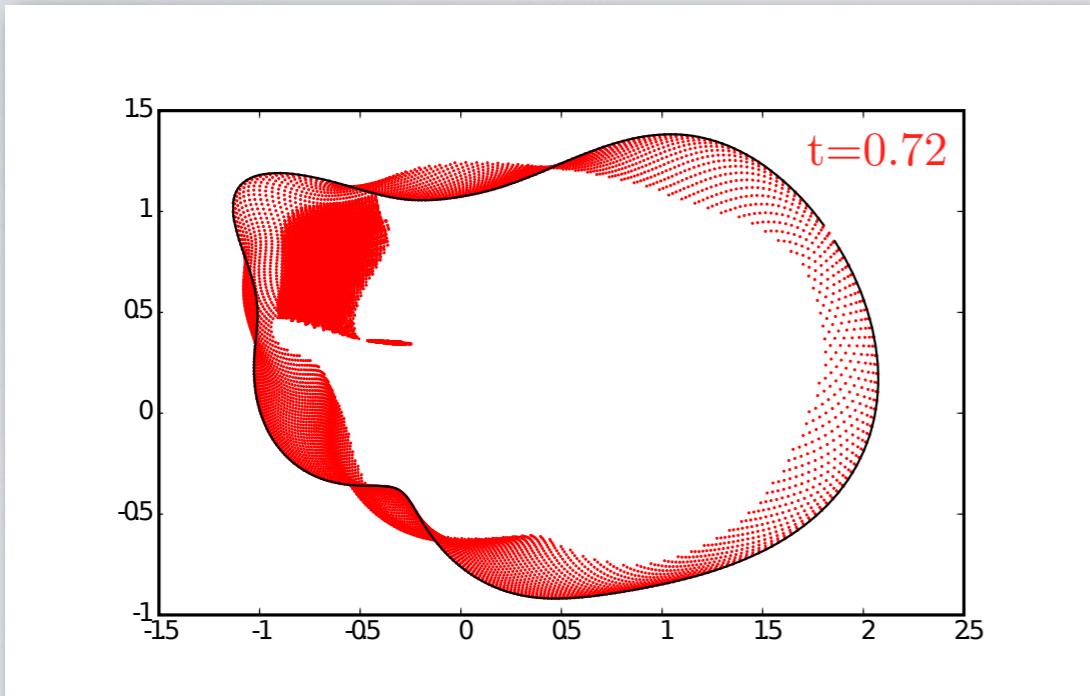


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Convexity defects

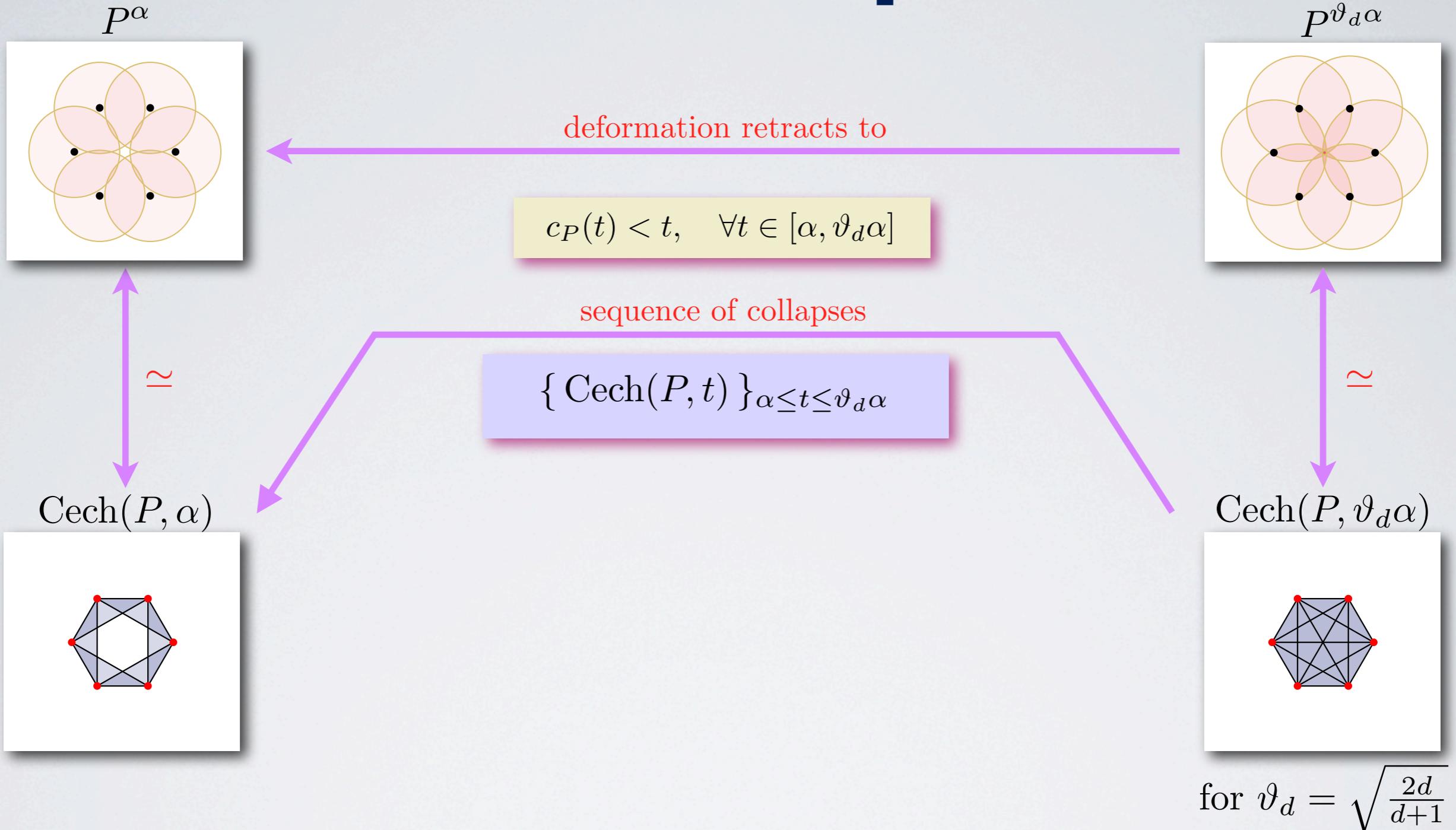


$$\text{Centers}(P, t) = \bigcup_{\substack{\emptyset \neq \sigma \subset P \\ \text{Rad}(\sigma) \leq t}} \{\text{Center}(\sigma)\}.$$

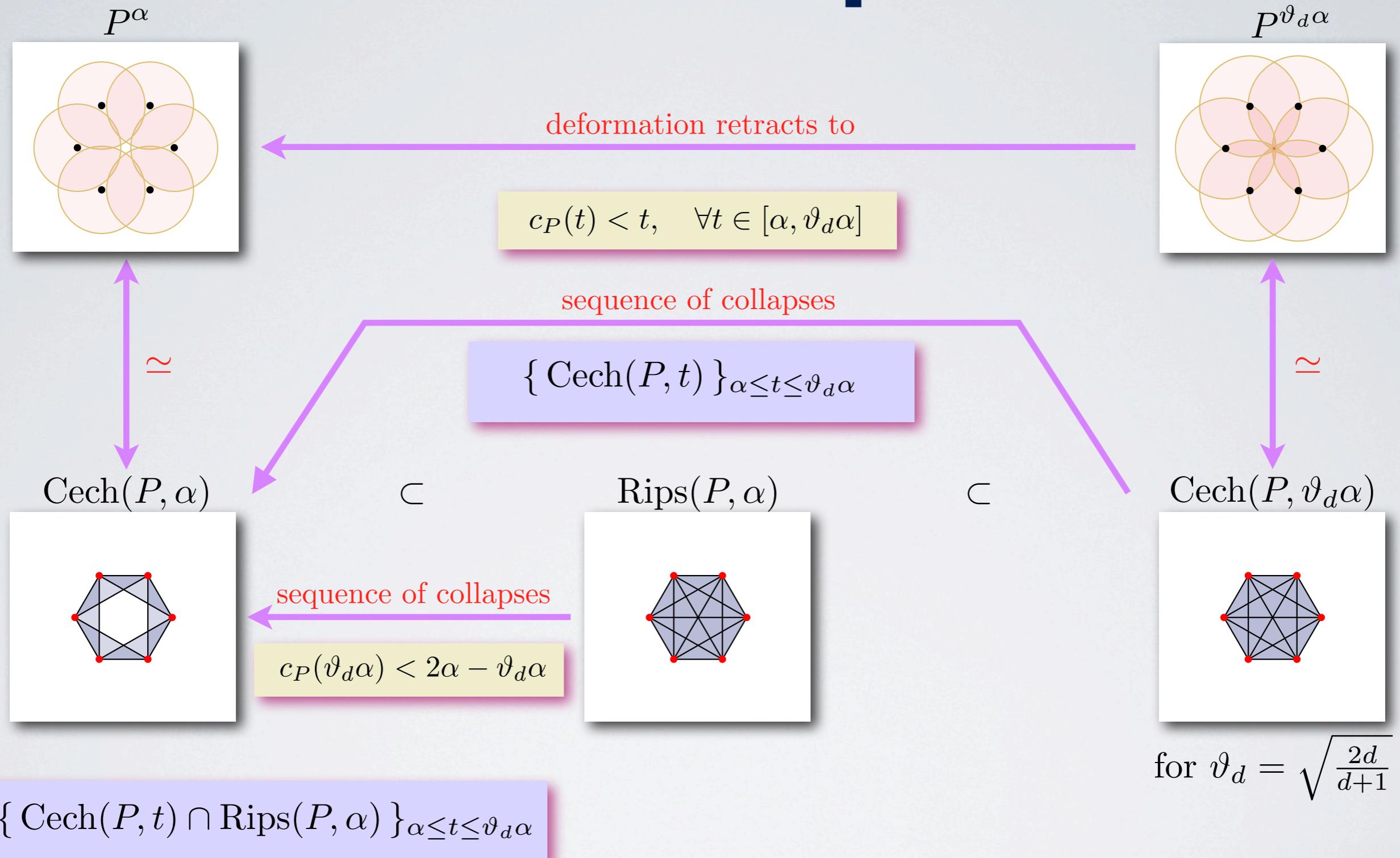
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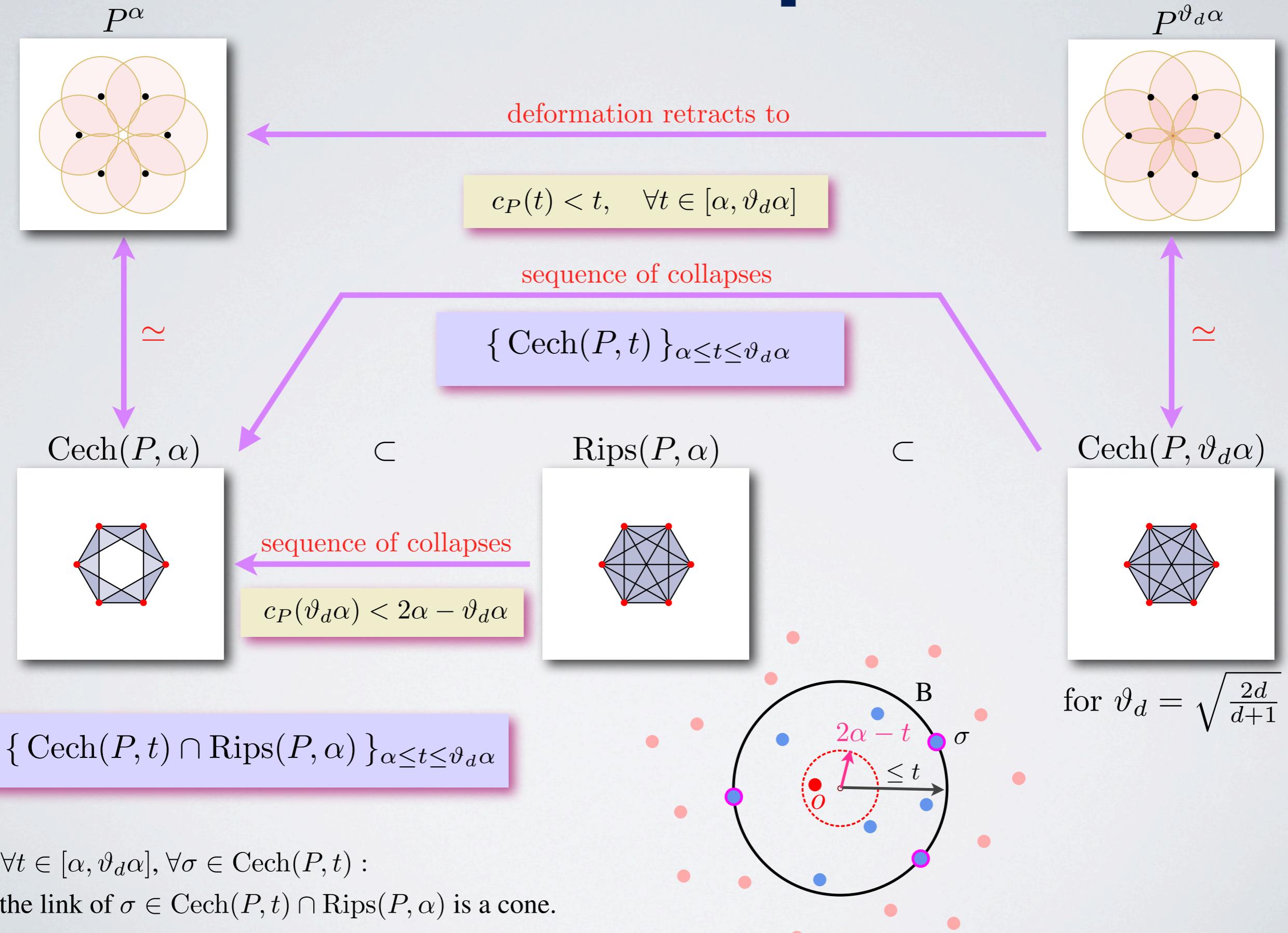
Roadmap



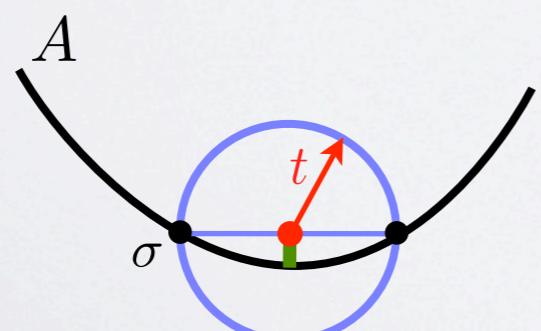
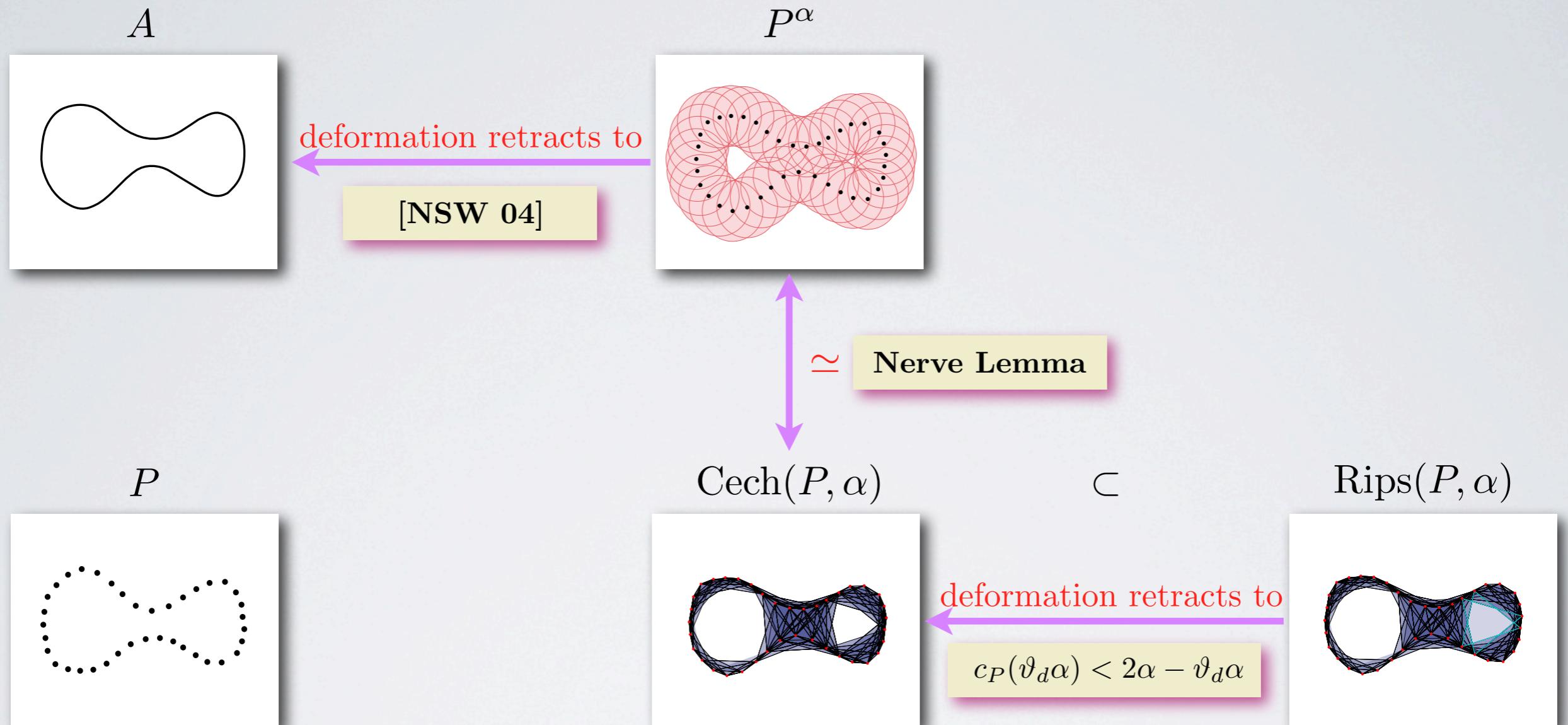
Roadmap



Roadmap



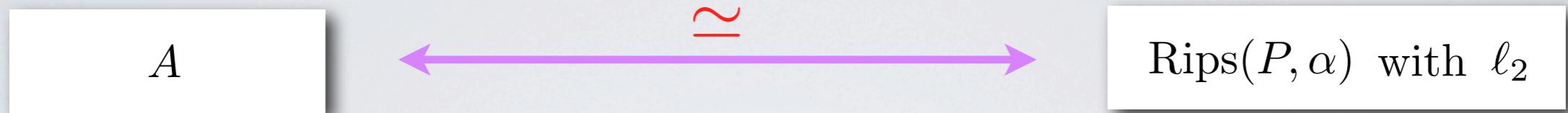
Rips complexes with L_2



if $d_H(A, P) \leq \varepsilon$, then for $t < \text{Reach}(A) - \varepsilon$

$$c_P(t) \leq \text{Reach}(A) - \sqrt{\text{Reach}(A)^2 - (t + \varepsilon)^2} + 2\varepsilon$$

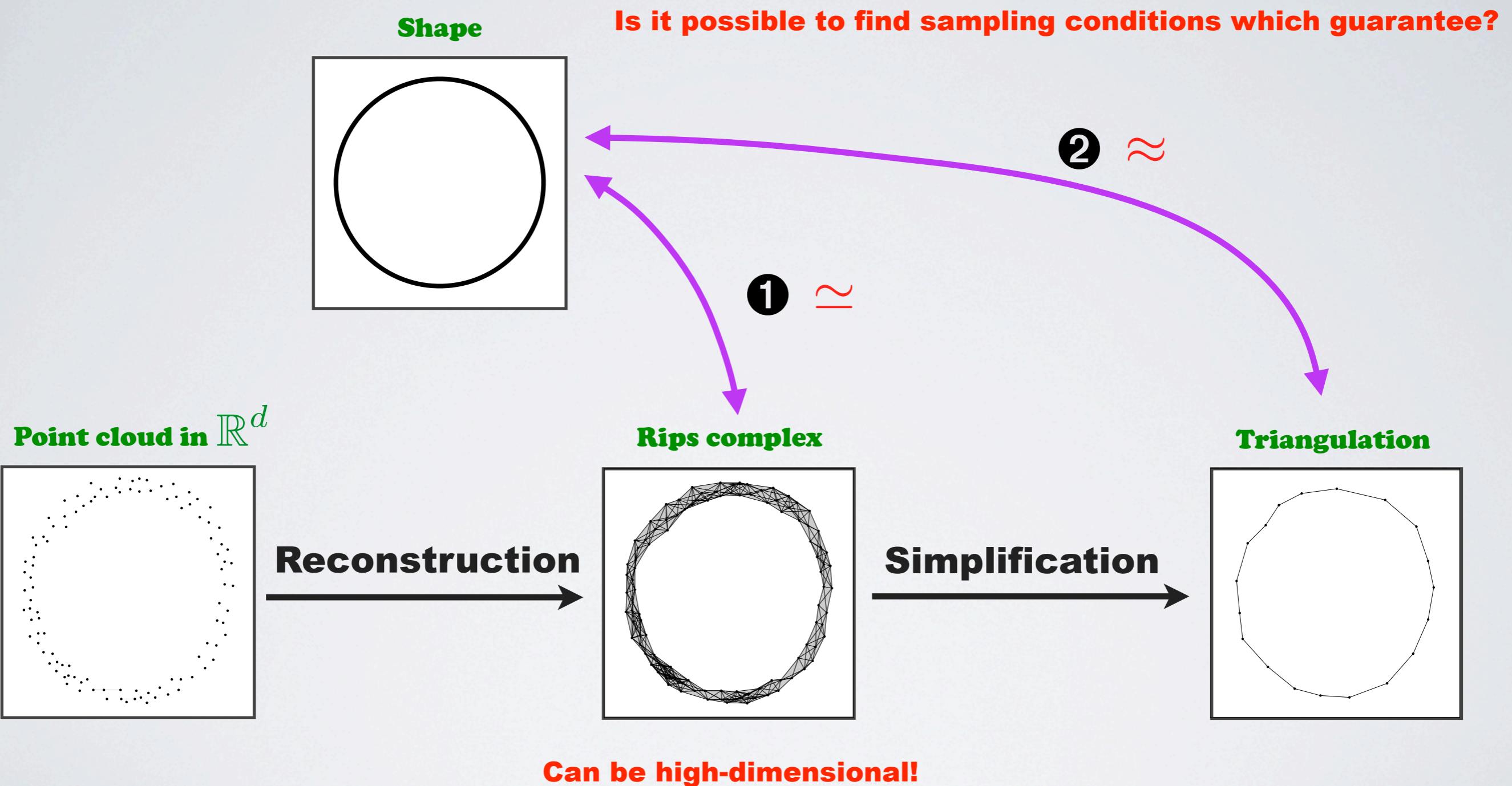
Shapes with a positive reach



if $d_H(A, P) \leq \varepsilon$ and $\frac{\varepsilon}{\text{Reach } A} < \lambda$ and $\frac{\alpha}{\varepsilon} = \eta$

Reconstruction	d	λ	η
P^α with [NSW04]	$\forall d$	$3 - \sqrt{8} \approx 0.17$	$2 + \sqrt{2} \approx 3.41$
Rips (P, α)	2	0.063	5.00
	3	0.055	5.46
	4	0.050	5.76
	5	0.047	5.97
	10	0.041	6.50
	100	0.035	7.22
	$+\infty$	$\frac{2\sqrt{2-\sqrt{2}}-\sqrt{2}}{2+\sqrt{2}} \approx 0.0340$	7.22

Overview

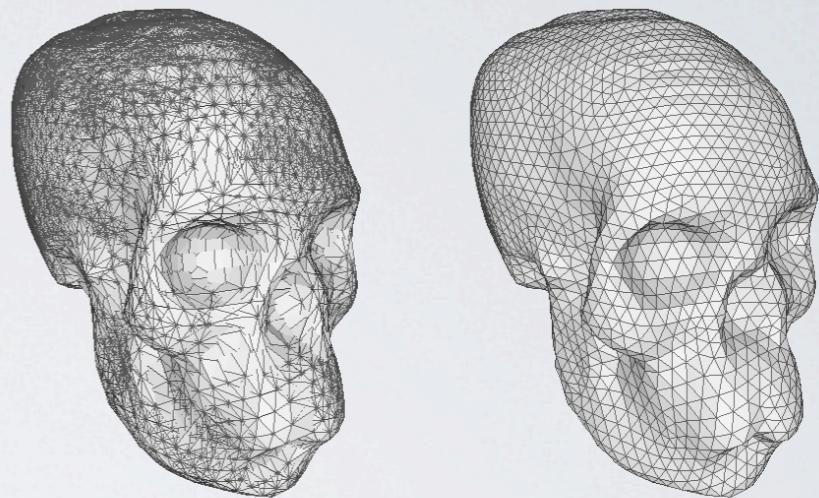


Does simplification exist?

How to get an object with the right dimension?

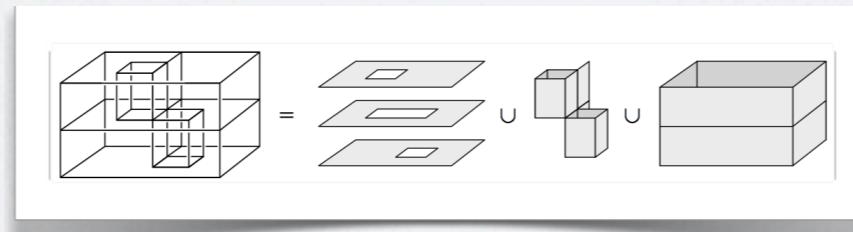
★ Different strategies:

- * Edge contractions;
- * Vertex and edge collapses ...
- * Seems to work well in practice



★ And yet, not all obvious that the Rips complex whose vertices sample a shape contains a subcomplex homeomorphic to that shape.

- * A triangulated Bing's house is contractible but not collapsible



- * Geometry has to play a key role.

Ongoing work

[A & Lieutier SoCG 2013]

Shape A

\approx

Triangulation of A

$\text{Rips}(P, \alpha)$

Ongoing work

[A & Lieutier SoCG 2013]

Shape A

\approx

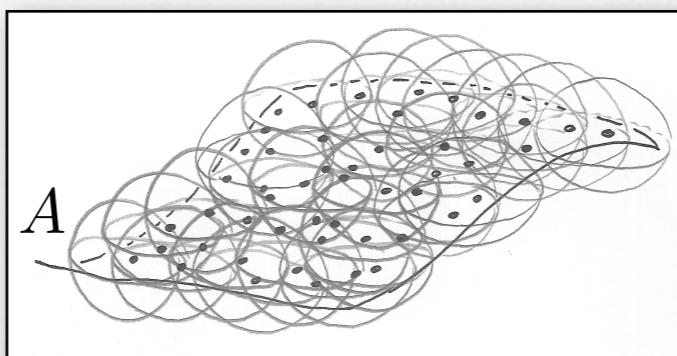
Triangulation of A

Cech(P, α)

sequence of collapses
 $c_P(\vartheta_d \alpha) < 2\alpha - \vartheta_d \alpha$

Rips(P, α)

Nerve{ $B(p, \alpha) \mid p \in P$ }



Ongoing work

[A & Lieutier SoCG 2013]

Shape A

\approx

Triangulation of A

$\text{Cech}_A(P, \alpha)$

sequence of collapses

$$d_H(A, P) \leq \varepsilon < (3 - \sqrt{8}) \text{Reach } A$$

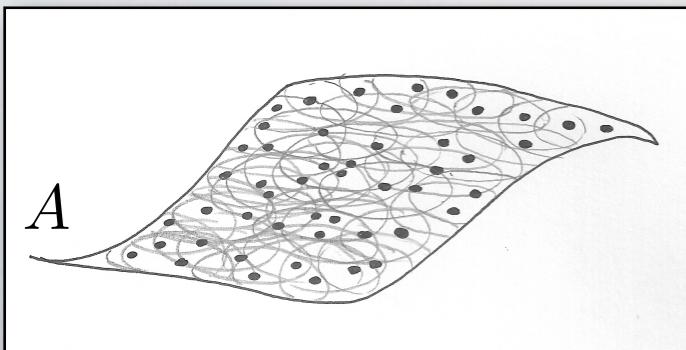
$\text{Cech}(P, \alpha)$

sequence of collapses

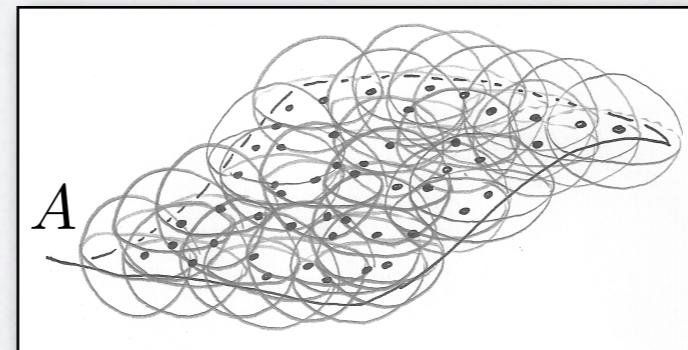
$$c_P(\vartheta_d \alpha) < 2\alpha - \vartheta_d \alpha$$

$\text{Rips}(P, \alpha)$

$\text{Nerve}\{A \cap B(p, \alpha) \mid p \in P\}$

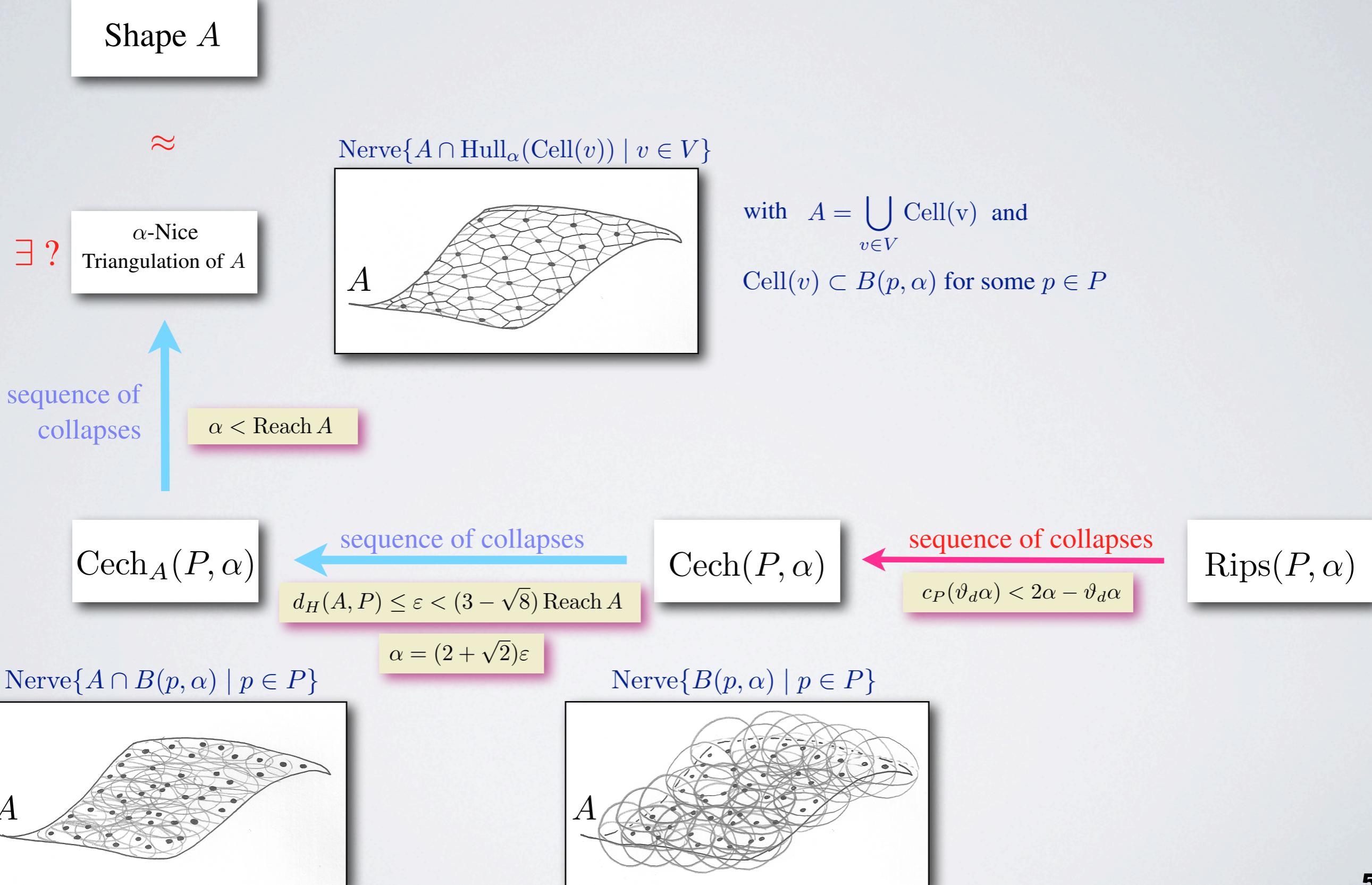


$\text{Nerve}\{B(p, \alpha) \mid p \in P\}$



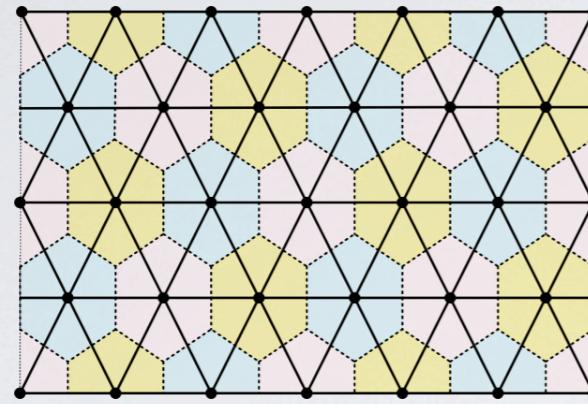
Ongoing work

[A & Lieutier SoCG 2013]

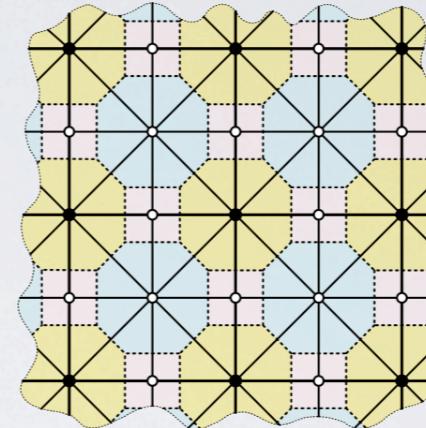


Future work

Shapes with α -nice triangulations?



Flat torus \mathbb{T}^2 in \mathbb{R}^4



\mathbb{R}^m

How to turn all this into a practical algorithm?

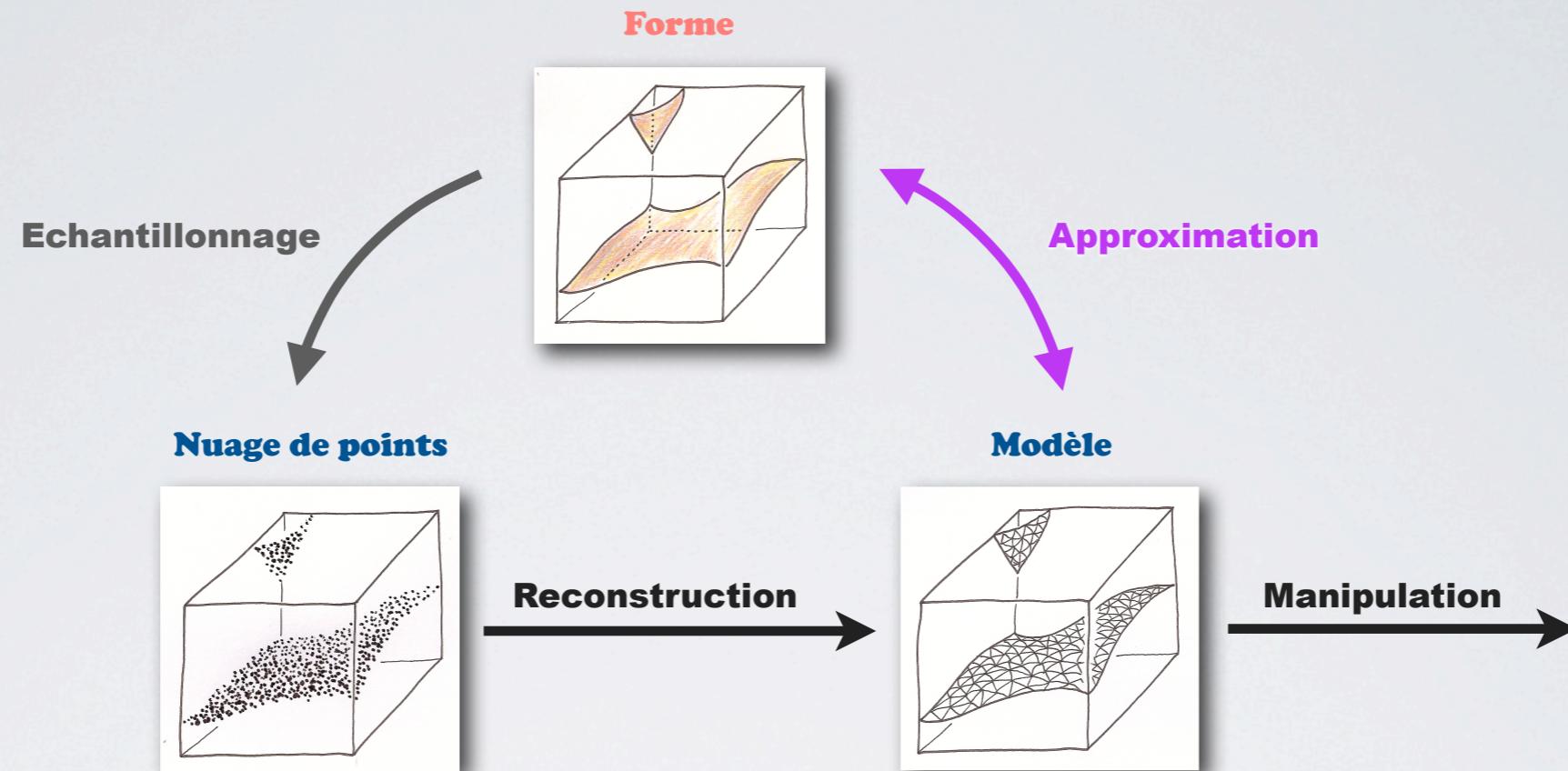
★ In general

- * Collapsibility of 3-complexes is NP-hard [Martin Tancer 2012]
- * Geometry has to play a key role.

★ For Rips complexes

- * whose vertices sample a convex set, a 0-manifold or a 1-manifold
- * How to go beyond?

Wrap-up



Géométrie élémentaire

Topologie

Algorithmique

- Fonction de distance, théorie de Morse, points critiques, gradient, axe médian, reach, ...
- Homéomorphisme, type d'homotopie, se rétracte par déformation, ...
- Complexes simpliciaux abstraits, Nerves, Flag complexes, collapse, ...
- Triangulation de Delaunay, Cech complex, Rips complex, ...
- Structure de données, complexité, preuves de NP-complétude, ...

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