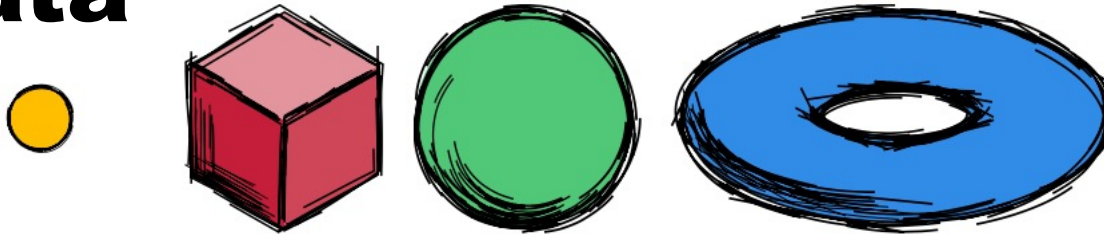


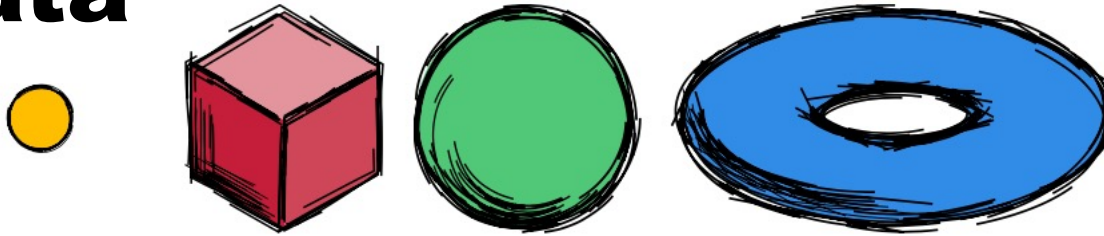
Shape of data



The shape of data



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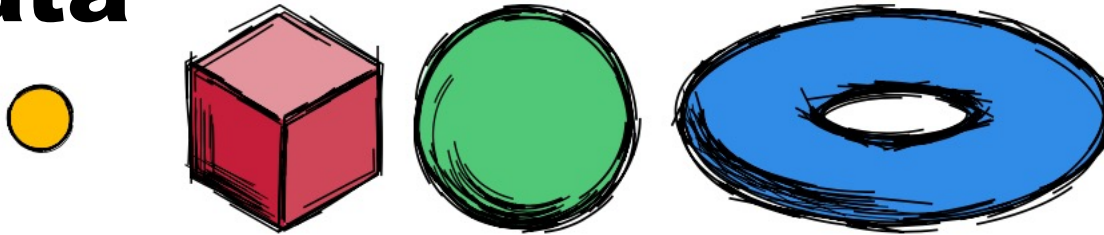
Betti numbers

β_0 Components

β_1 1-dim circular holes

β_2 voids

The shape of data



Betti numbers

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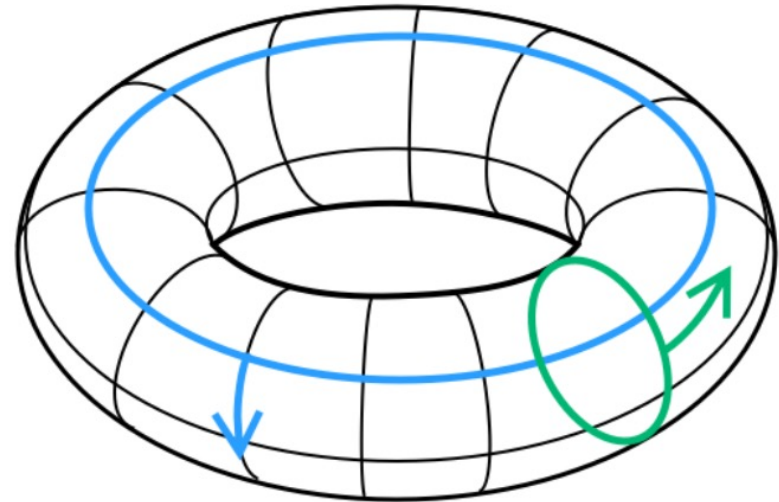
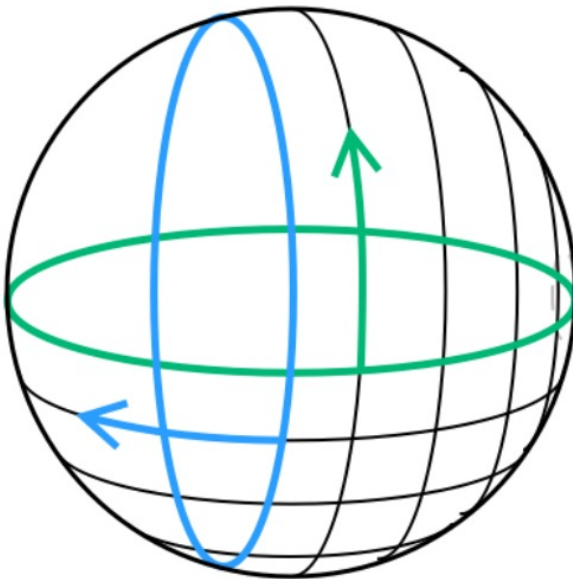
Space	β_0	β_1	β_2
Point	1	0	0
Cube	1	0	1
Sphere	1	0	1
Torus	1	2	1

1895 Poincare
 1925 E. Noether
 2000 Data analysis

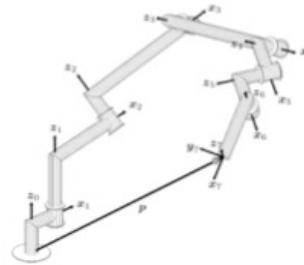
Why?



Space	β_0	β_1	β_2
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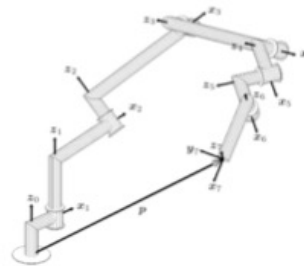


Algebraic models of data



6R IKP: general fiber of $\underbrace{\mathbb{P}^1 \times \dots \times \mathbb{P}^1}_{6 \text{ times}} \rightarrow Q \subset \mathbb{P}^7$

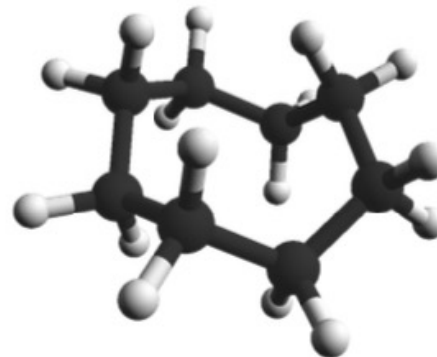
Algebraic models of data



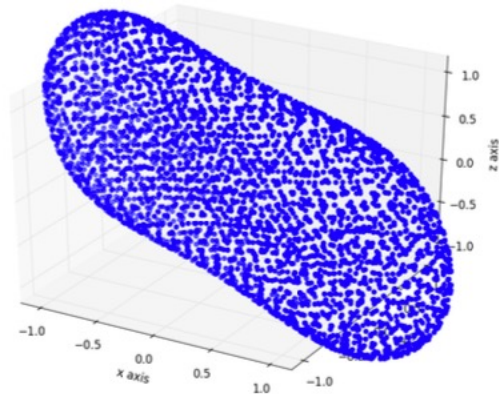
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Configuration space of
Cyclooctane

13 equations in 15 variables

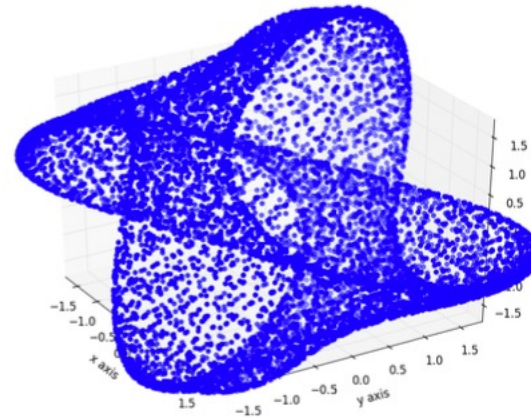


Cyclooctane solutions



Spherical component

$$\begin{array}{l} \beta_0 \quad 1 \\ \beta_1 \quad 0 \\ \beta_2 \quad 1 \end{array}$$



Klein component

$$\begin{array}{l} \beta_0 \quad 1 \\ \beta_1 \quad 2 \\ \beta_2 \quad 0 \end{array}$$

Two main questions



2019-2022

1. Provide criteria for **density** of sampling
2. Give algorithms for **sampling**



D. Eklund
RISE



M. Weinstein
Stanford



P. Edwards
Notre Dame



O. Gävfert
KTH->Oxford



Jon Hauenstein
Notre Dame



S. Di Rocco
KTH



Vetenskapsrådet



Density



Definition

A *sample* of a variety $X \subset \mathbb{R}^n$ is a finite subset $E \subset X$. For $\varepsilon > 0$ a sample $E \subset X$ is called an ε -sample if for every $x \in X$ there is an element $e \in E$ such that $\|x - e\| < \varepsilon$.

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Consider the Čech complex, $C(E, \varepsilon) = \mathcal{R}_\varepsilon$, given by the nerve of the union of all closed ε -balls $\overline{B}_e(\varepsilon)$.

Density



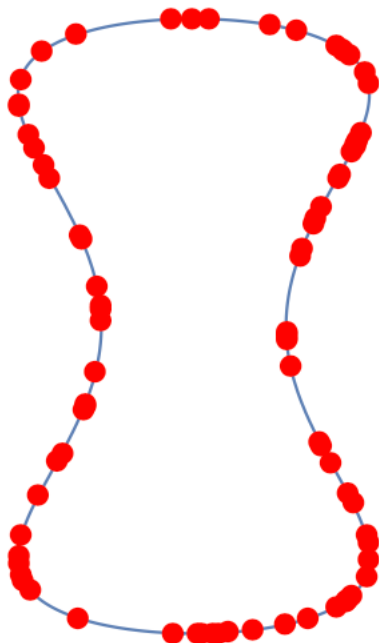
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The sample E gives a **topological signature** of the variety if the homology of X can be computed from the homology of $C(E, \varepsilon)$.

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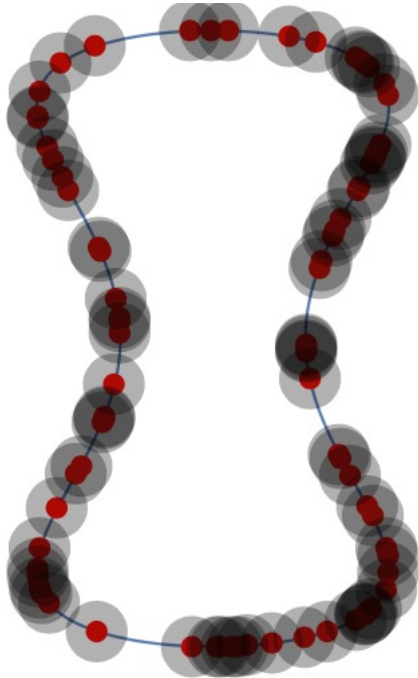
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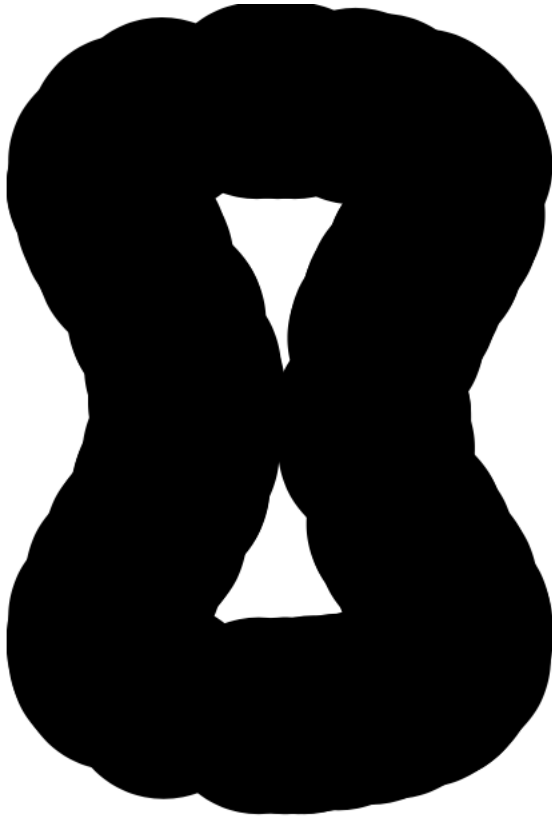
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Density



Theorem

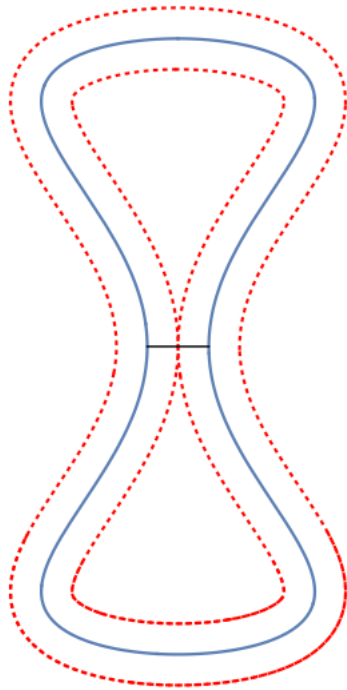
The homology groups of X can be recovered from an ε -sample if $\varepsilon < \tau_X$.

- ▶ Niyogi-Smale-Weinberger 2005 Discrete Comp. Geom.
- ▶ Chazal and Lieutier 2005
- ▶ Cohen-Steiner et al 2007
- ▶ Cucker-Krick-Shub, 2018 Fo.C.M
- ▶ Bürgisser-Cucker-Lairez 2019 J.ACM

Dansity



Bottleneck degree



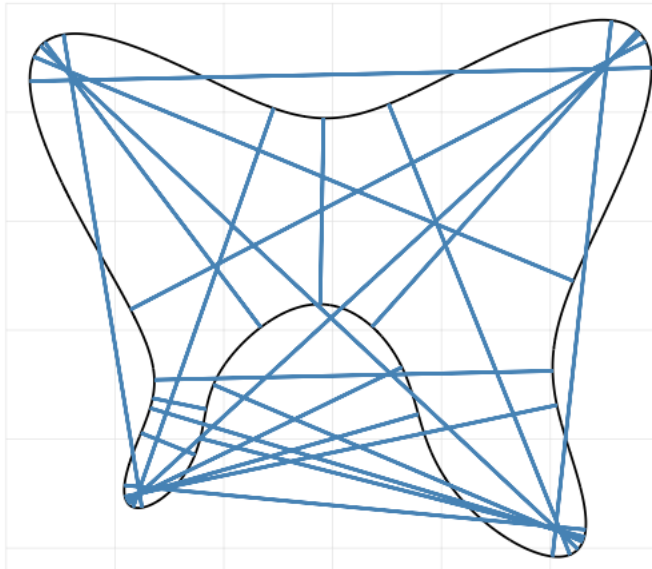
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-
- Di Rocco-Eklund-Weinstein 2020 SIAM J. of A.G.
 - Di Rocco-Eklund-Gäfvert 2022 J. of Math Comp
 - Di Rocco-Edward-Eklund-Gäfvert-Hawenstein 2022

The bottleneck of a curve

Quartic curve $x^4 + y^4 + 1 - 4y - x^2y^2 - 4x^2 - x - 2y^2 = 0$
in \mathbb{R}^2 and its 22 bottleneck lines.





Theorem (DR-Eklund-Weinstein, 2020)

Let $X \subset \mathbb{P}^n$ be a smooth m -dimensional variety in **general position**. Let $k = \min\{\lfloor \frac{n-1}{2} \rfloor, m\}$ and for $i = 0, \dots, k$, put $\varepsilon_i = \sum_{j=r_i}^{m-i} \deg p_j$ where $r_i = \max\{0, m - n + 1 + i\}$.

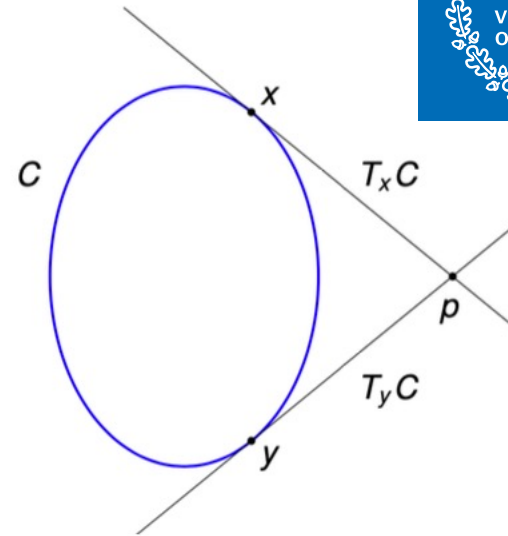
$$\mathbf{BND}(\bar{X}) = \sum_{i=0}^k \varepsilon_i^2 - \deg B_{m,n},$$

for some polynomial $B_{m,n}$ in the polar classes and the hyperplane class of X .

Polar classes

- 1070-1910 Segre, Noether
- 1920-1940 Severi, Todd
- 1970- Kleiman, Fulton

- 2000- June Hu

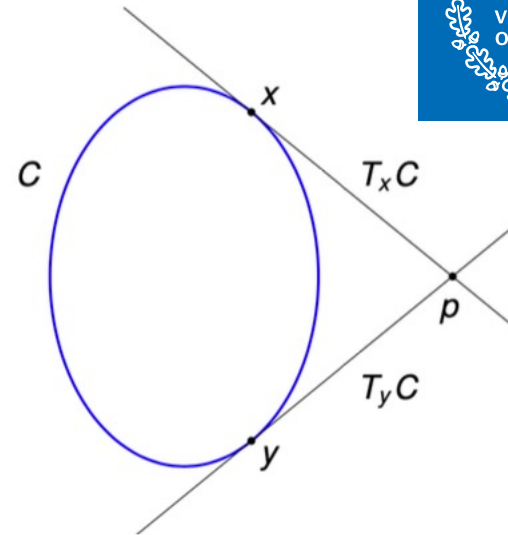


- ▶ $P_1(X, p) = \{x, y\}$ is the first polar locus of the ellipse.
- ▶ The polar locus depends on the choice of p but two polar loci $P_1(X, p)$ and $P_1(X, p')$ represent the same *polar class* p_1 on C .

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THANKS!