

MEASURING SCALE
BEFORE SIMPLIFICATION

HERBERT EDELSBRUNNER

BMS

MEASURING SCALE BEFORE SIMPLIFICATION

- I. FUNCTIONS
- II. CURVES
- III. SOMITES
- IV. MOTION

I. FUNCTIONS

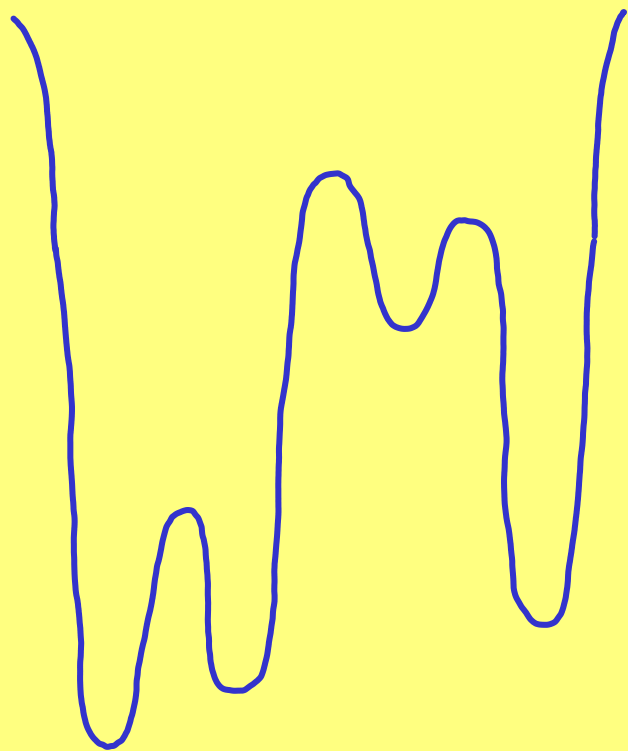
I₁ PERSISTENCE



function

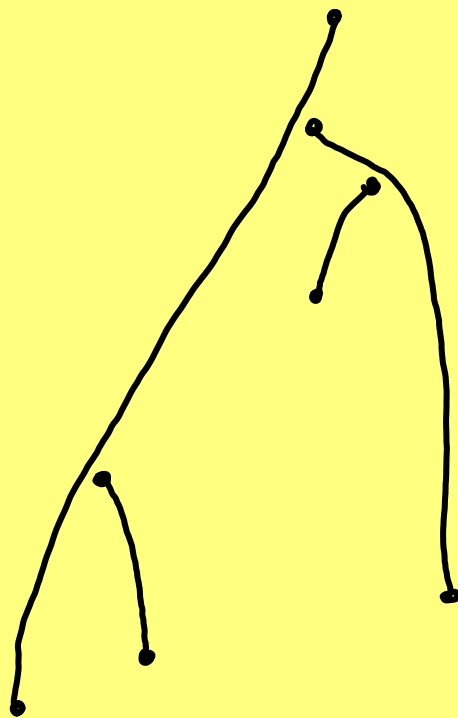
$$f: S^1 \rightarrow \mathbb{R}$$

I.1 PERSISTENCE



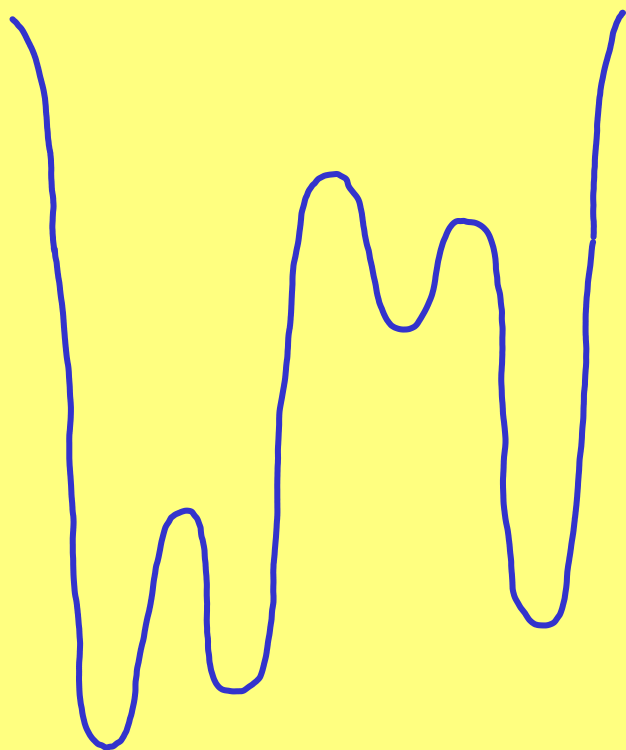
function

$$f: S^1 \rightarrow \mathbb{R}$$



merge tree

I.1 PERSISTENCE



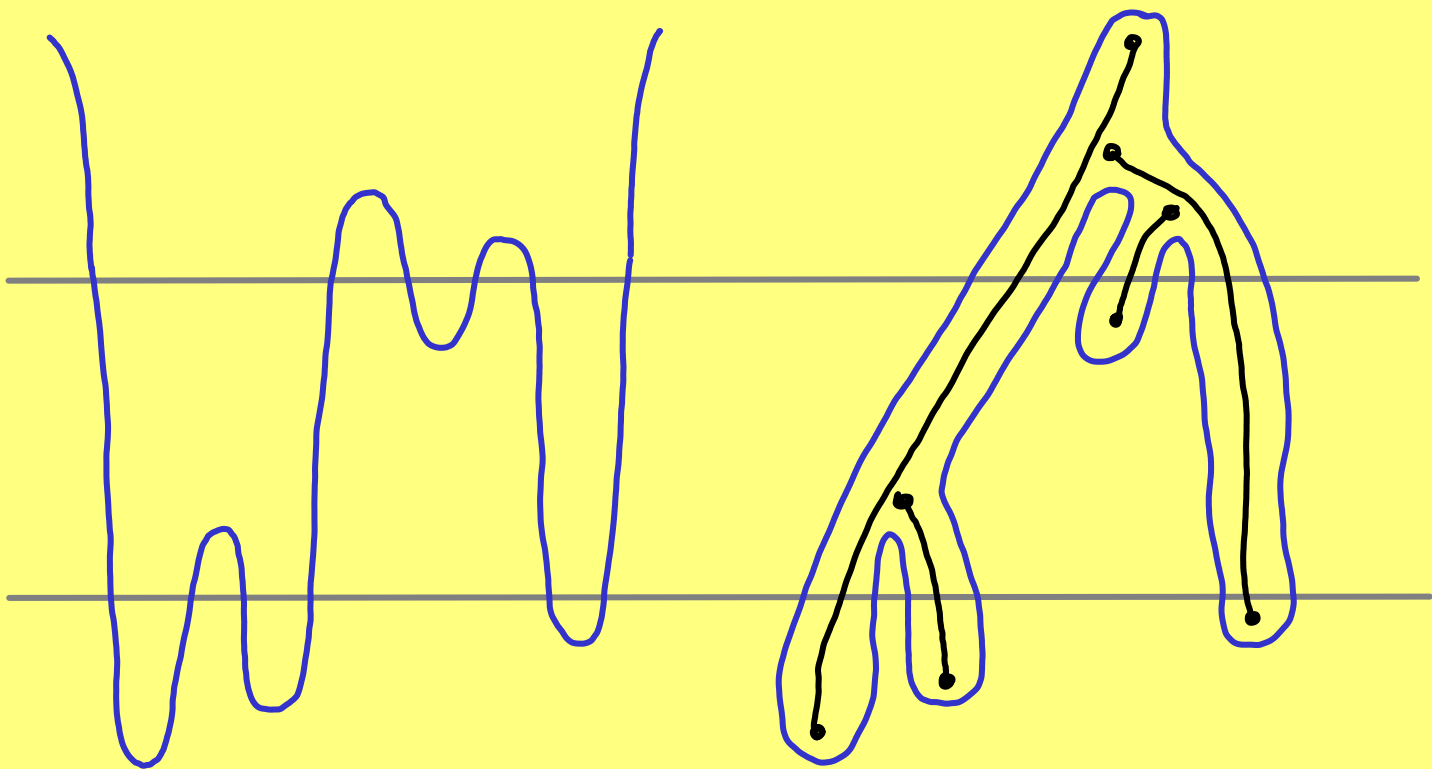
function

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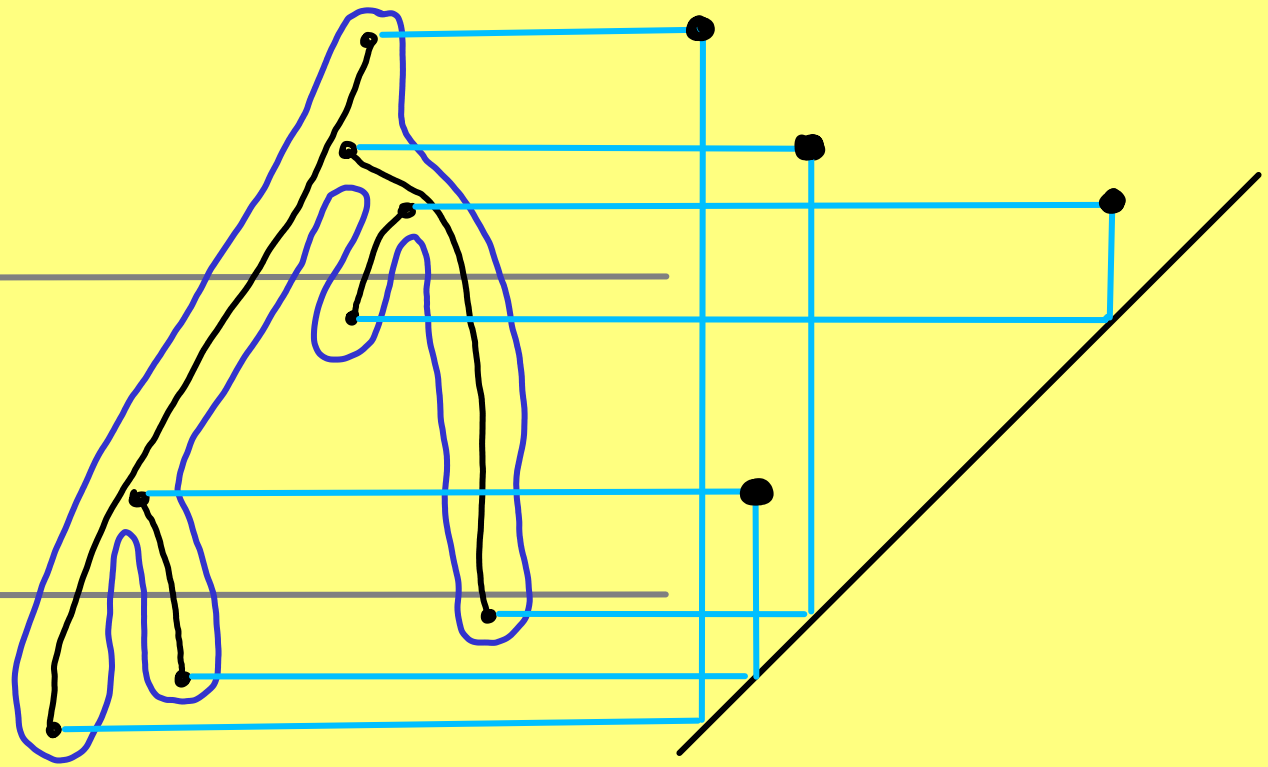
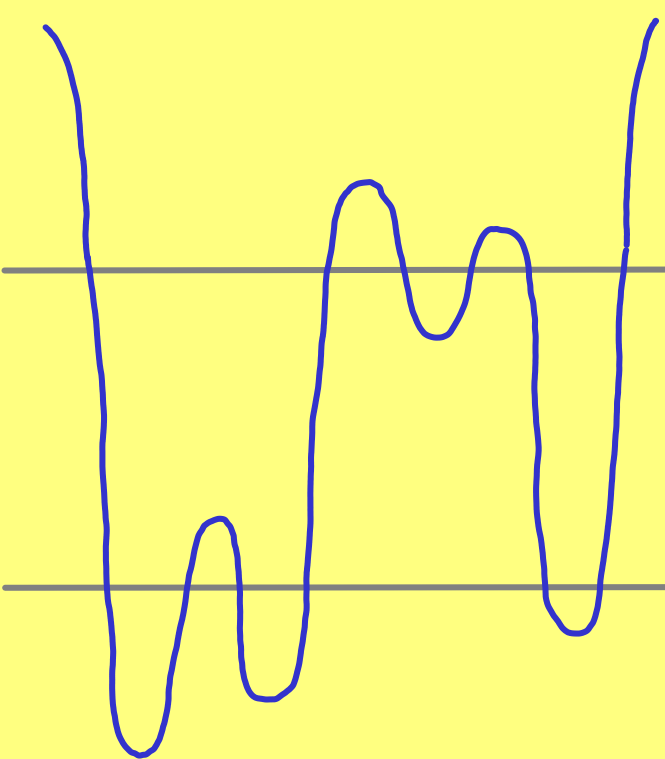


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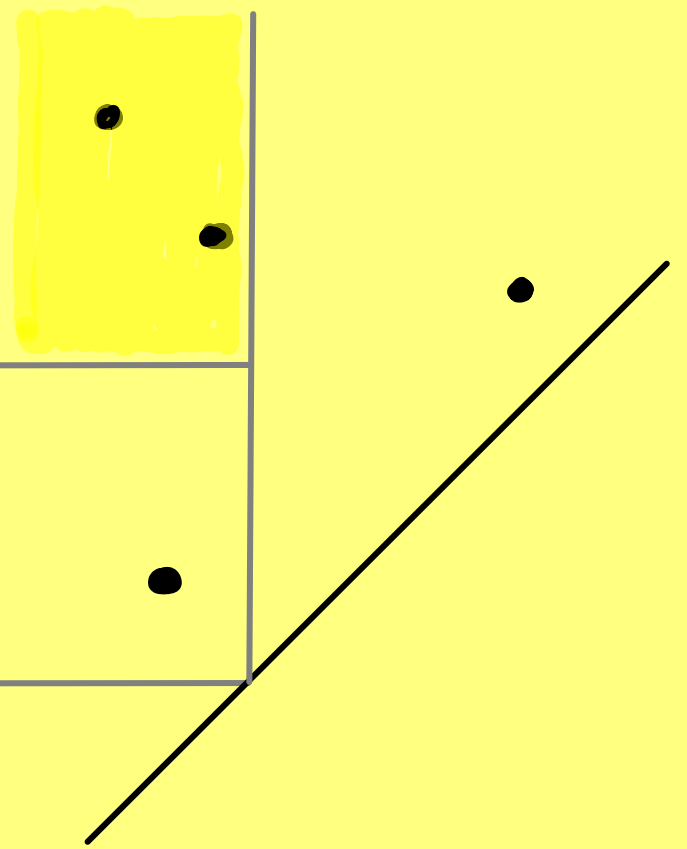
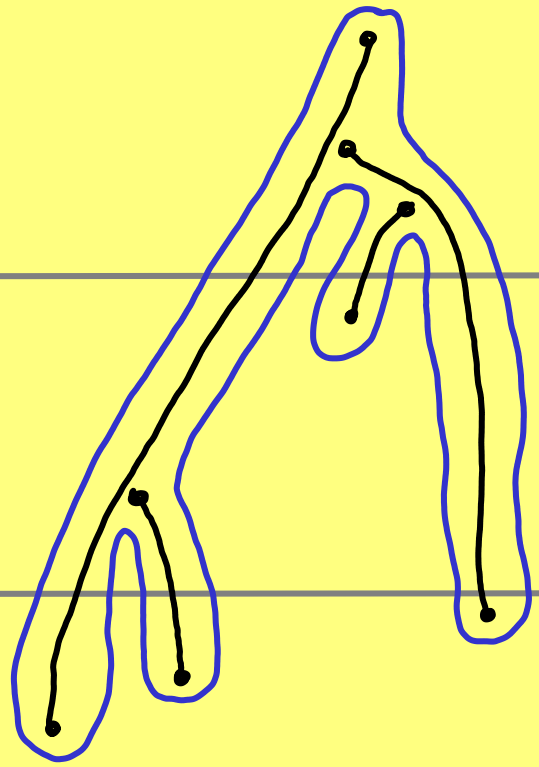
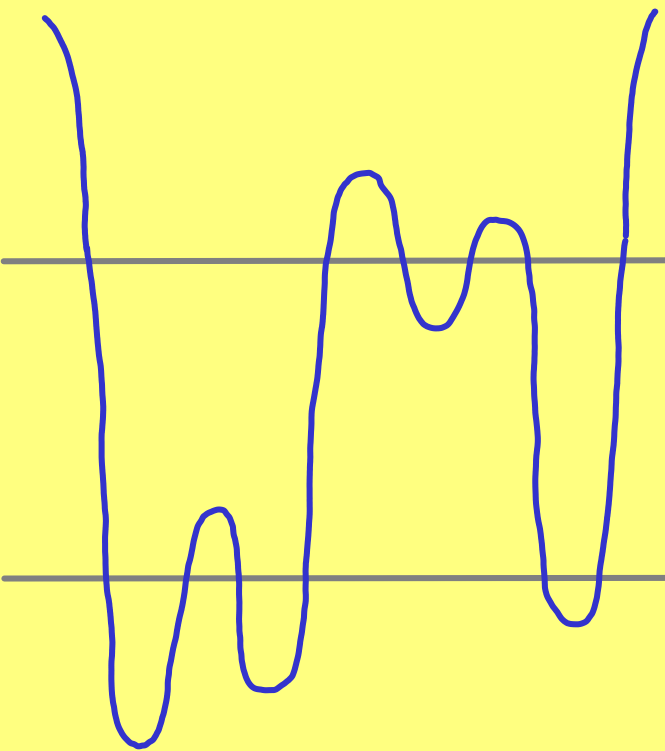


function
 $f: S^1 \rightarrow \mathbb{R}$

merge tree

persistence diagram
 $Dgm(f)$

I.1 PERSISTENCE

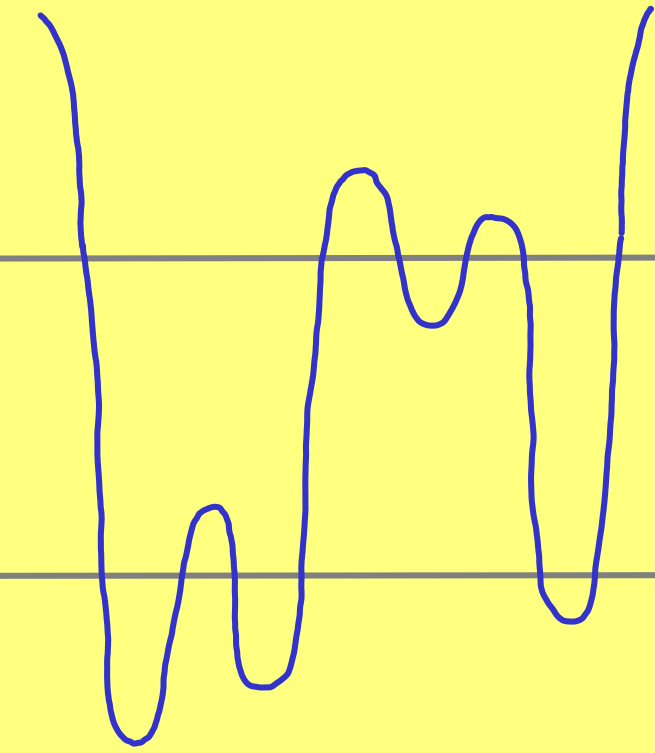


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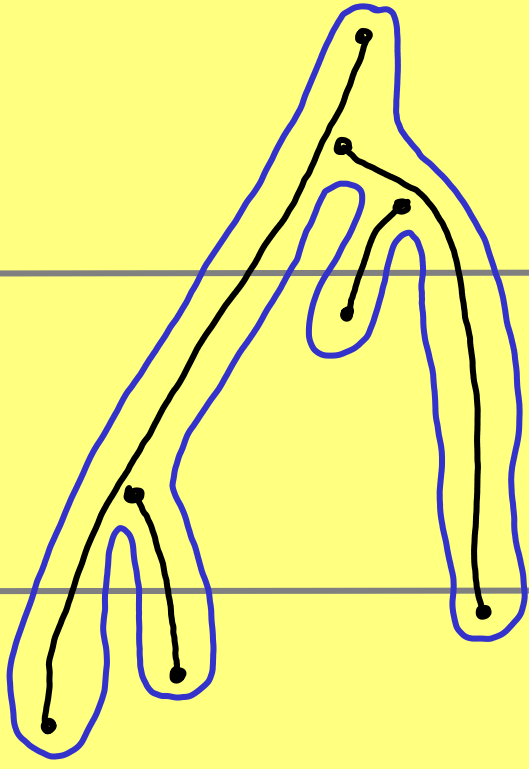
merge tree

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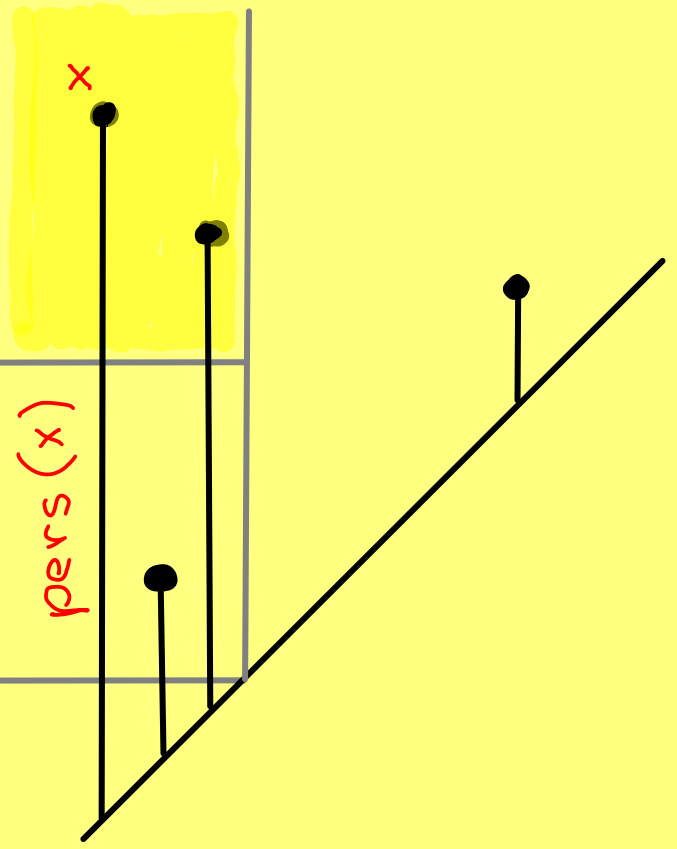
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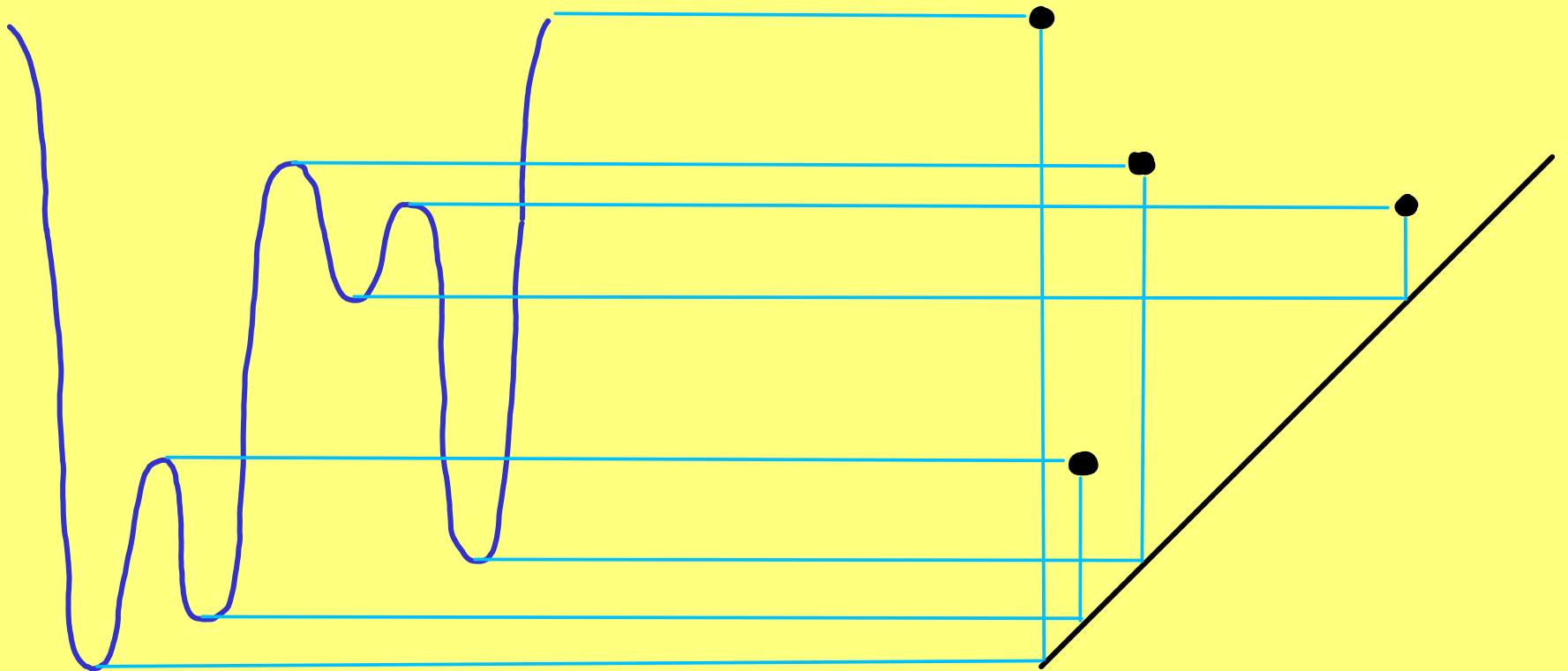
persistence diagram
 $Dgm(f)$

I.2 L_∞ -STABILITY

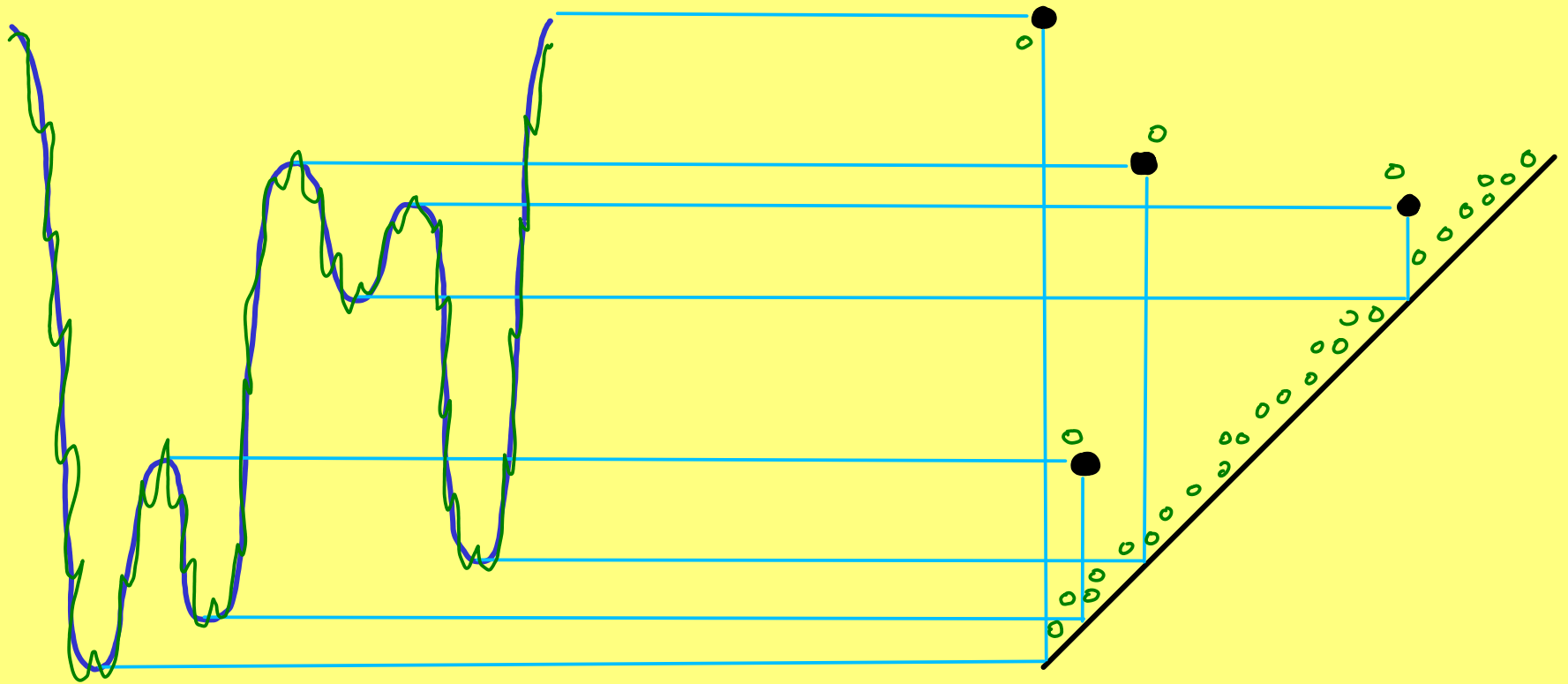
THM. For tame functions $f, g: X \rightarrow \mathbb{R}$ the bottleneck distance between their diagrams is bounded by the max-difference between the functions,

$$d_B(D_{\text{gm}}(f), D_{\text{gm}}(g)) \leq \|f - g\|_\infty.$$

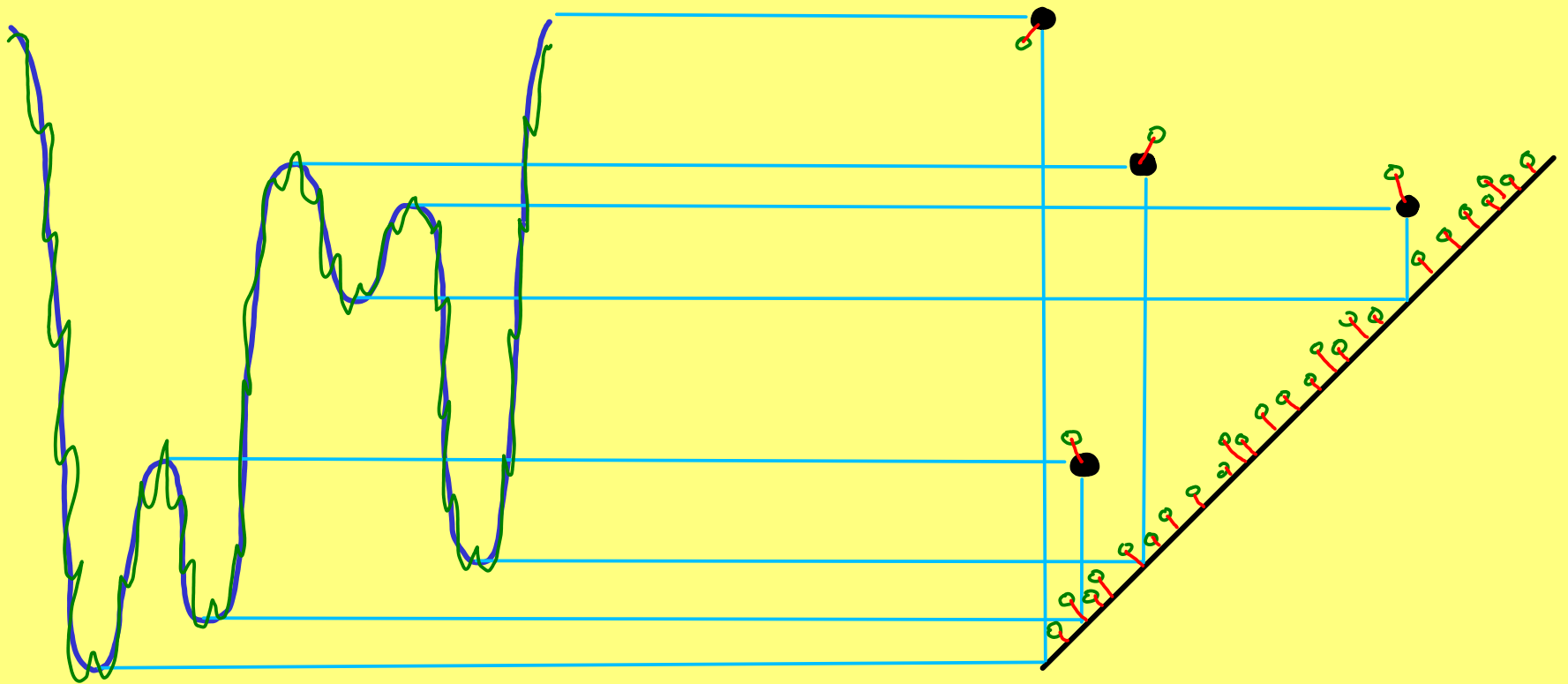
I.2 L_∞ -STABILITY



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I.2 L_∞ -STABILITY



$$d_{\mathcal{B}}(\text{Dgm}(f), \text{Dgm}(g)) \leq \|f - g\|_\infty.$$

I.3 L_p -STABILITY

DEF. $f: X \rightarrow \mathbb{R}$ has Lipschitz constant C if $f(x) - f(y) \leq C \|x - y\|$.

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DEF. The p -th Wasserstein distance between the diagrams of f and g is

$$W_p(f, g) = \inf_{\substack{\gamma: D_{\text{gm}}(f) \rightarrow D_{\text{gm}}(g) \\ \text{bijection}}} \sum_{x \in D_{\text{gm}}(f)} \|x - \gamma(x)\|_1^p.$$

I.3 L_p -STABILITY

THM. Let X be a compact metric space and $f, g: X \rightarrow \mathbb{R}$ two Lipschitz functions. Then there exist constants k and C that depend on X and the Lipschitz constants of f and g s.t.

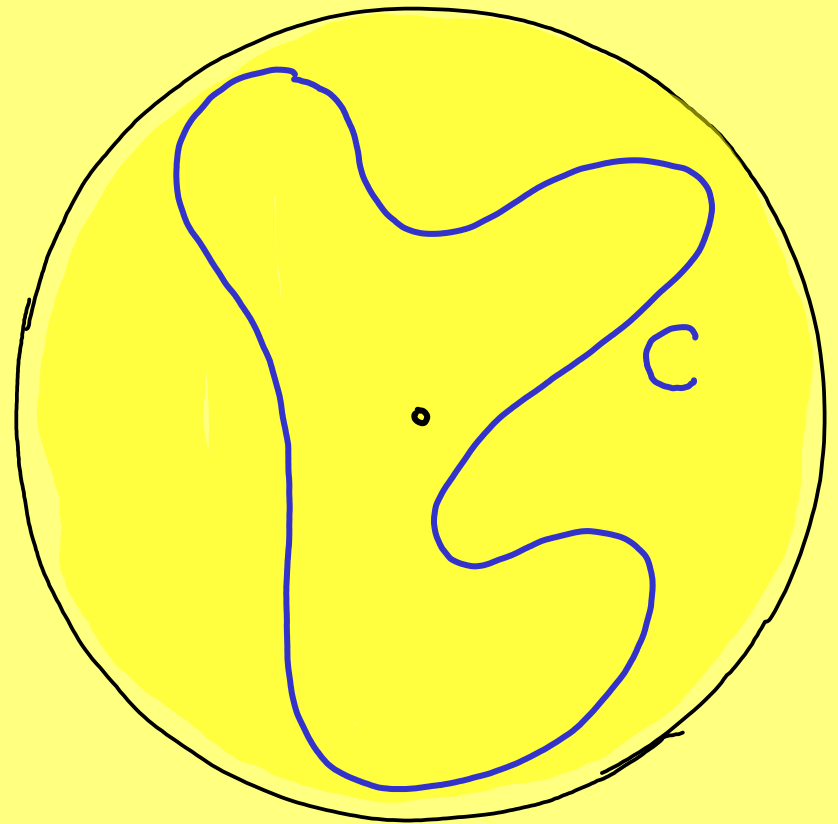
$$W_p(f, g) \leq C \|f - g\|_\infty^{p-k}$$

for every $p \geq k$.

II. CURVES

II.1 FARY'S THEOREM

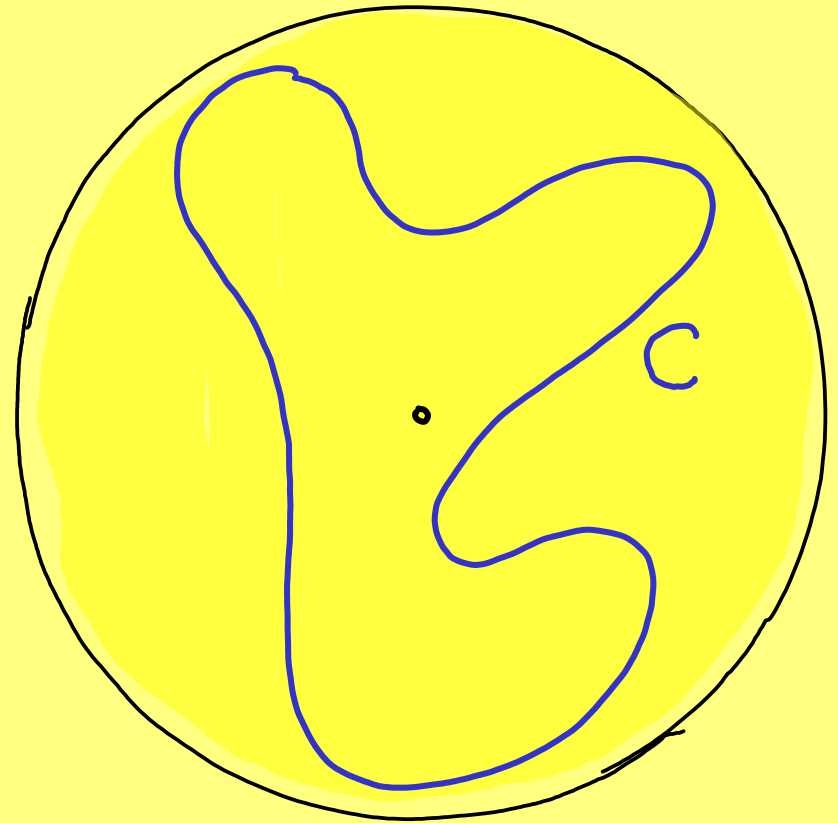
C = smooth curve
inside unit disk



II.1 FARY'S THEOREM

C = smooth curve
inside unit disk

$L(C)$ = length

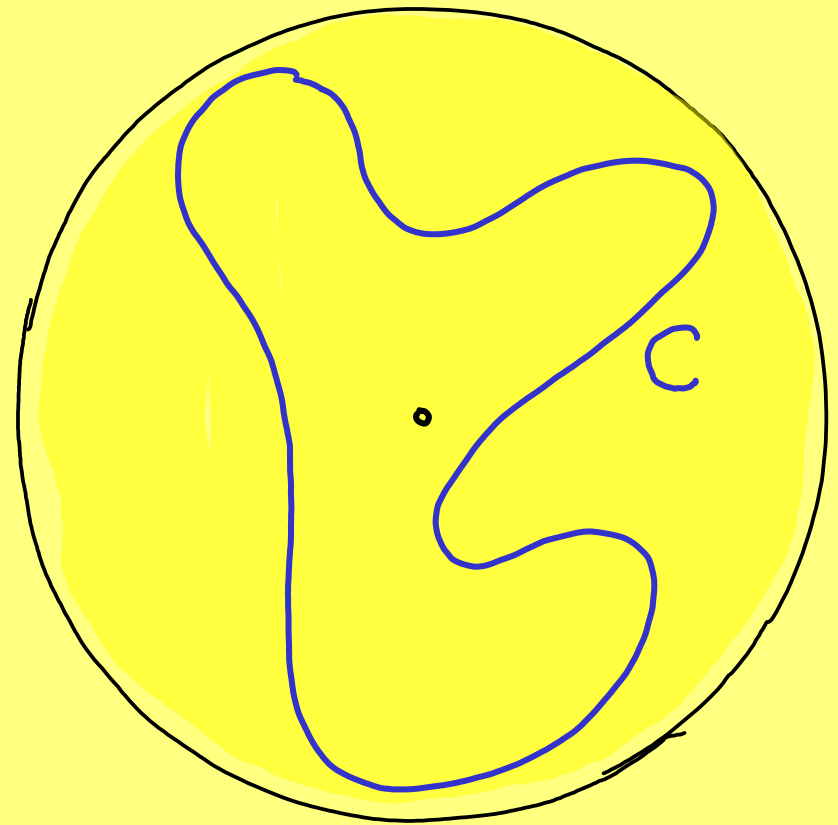


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$K(C)$ = total curvature



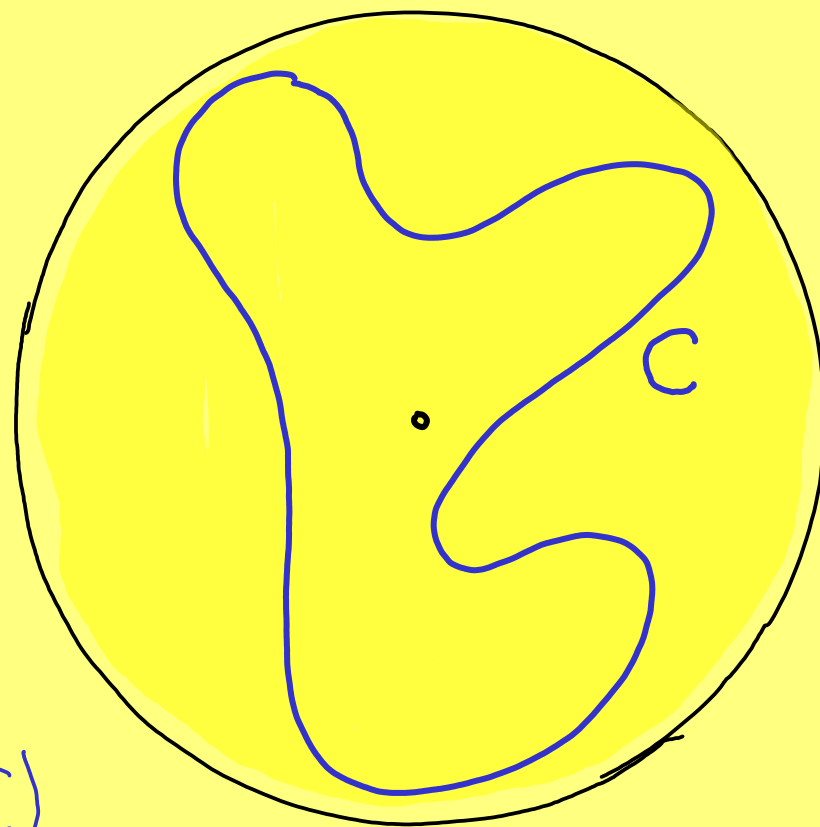
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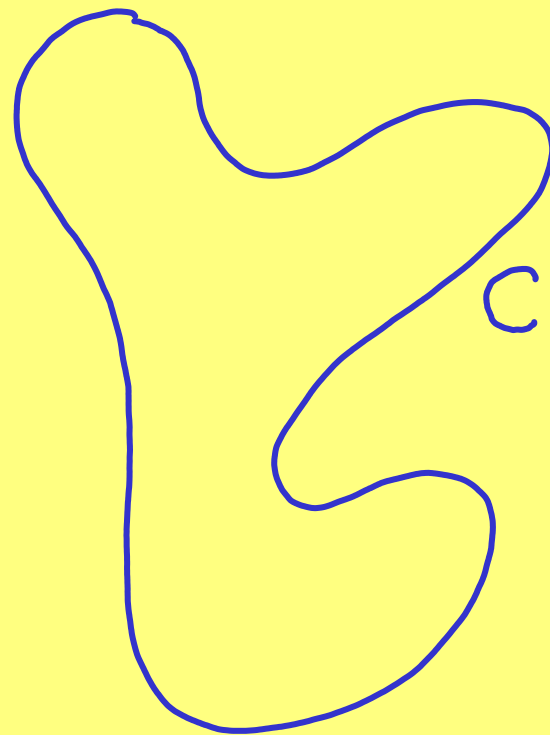
$K(C)$ = total curvature

FARY: $L(C) \leq K(C)$.

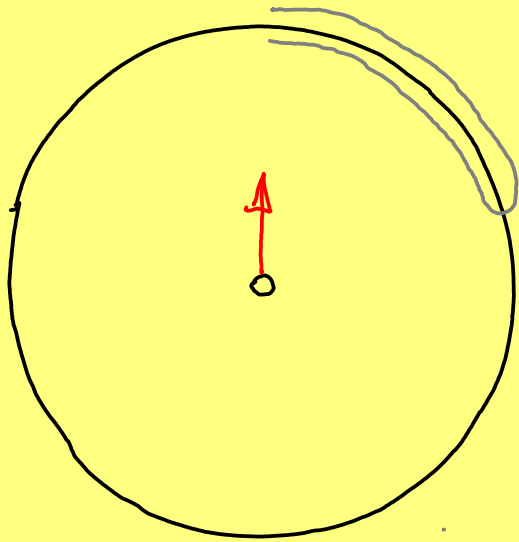


II.2 TOTAL CURVATURE

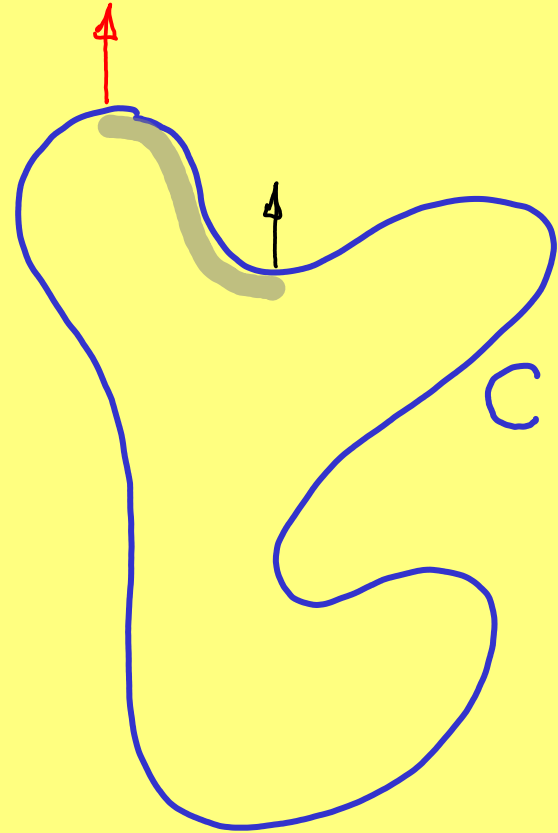
$$K(C) = \int_{x \in C} |k(x)| dx$$



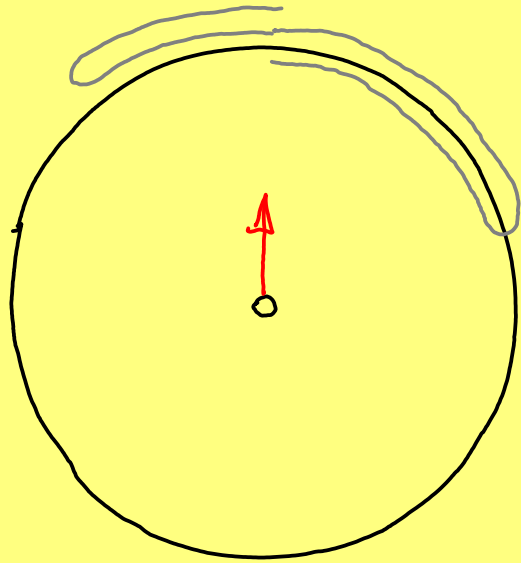
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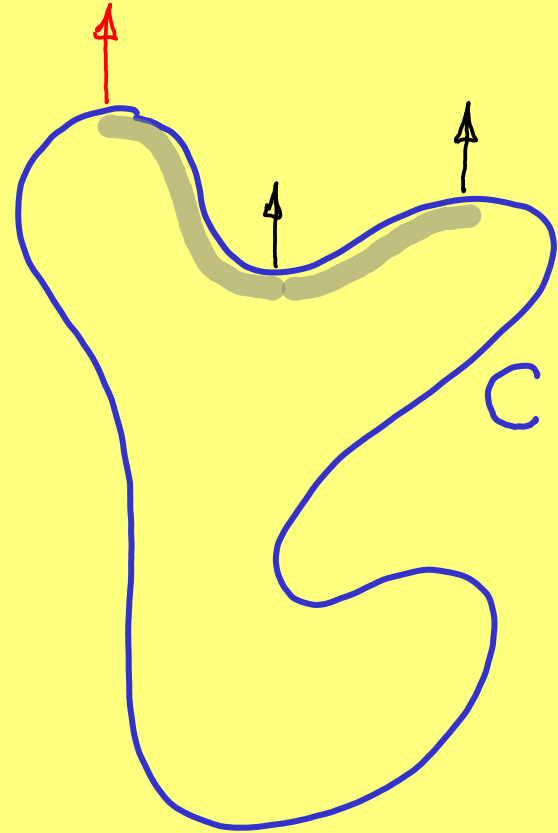
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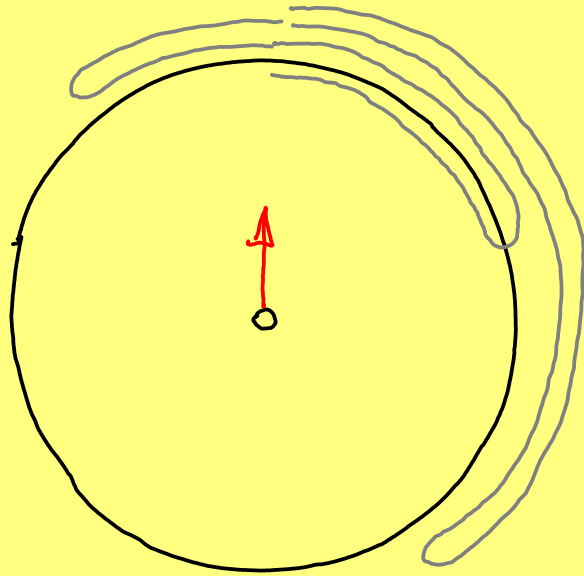
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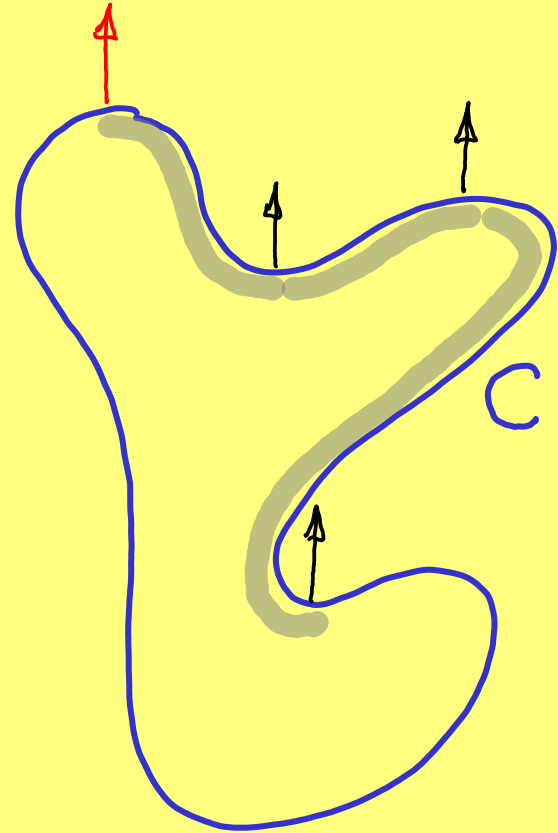
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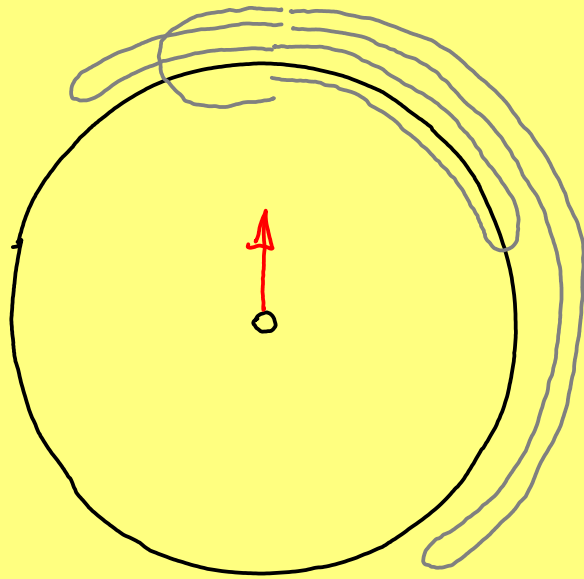
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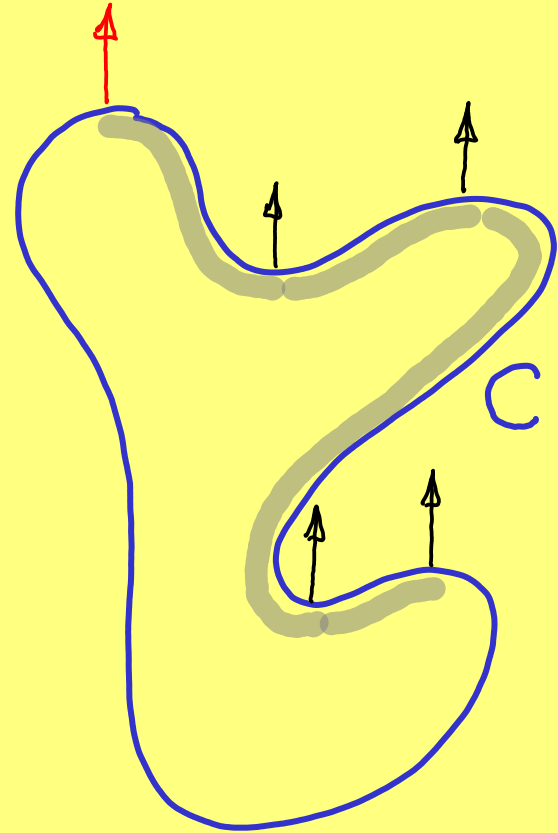
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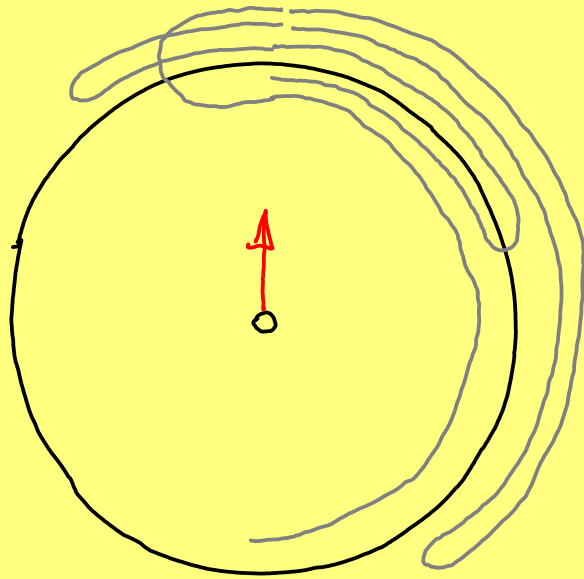
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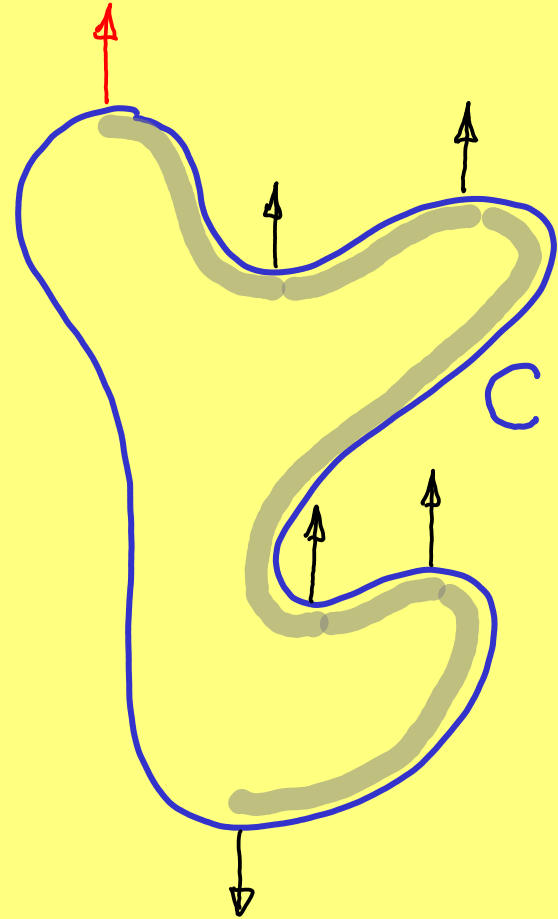
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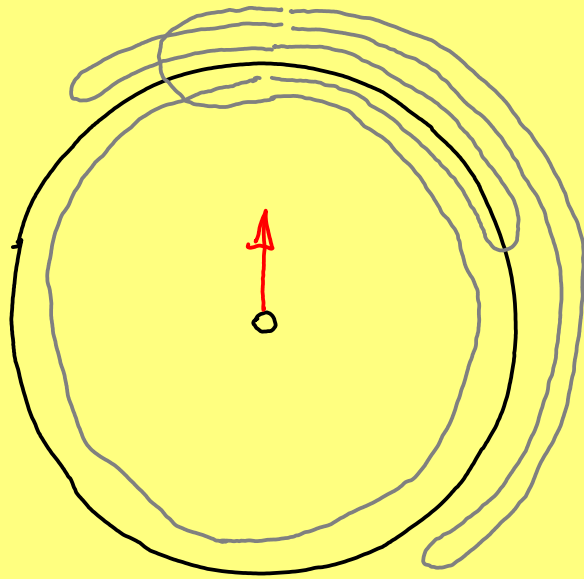
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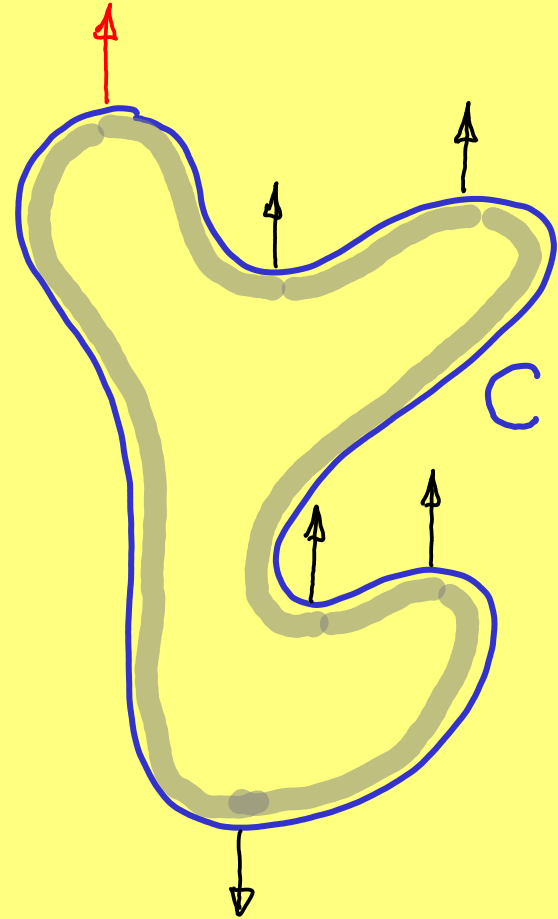
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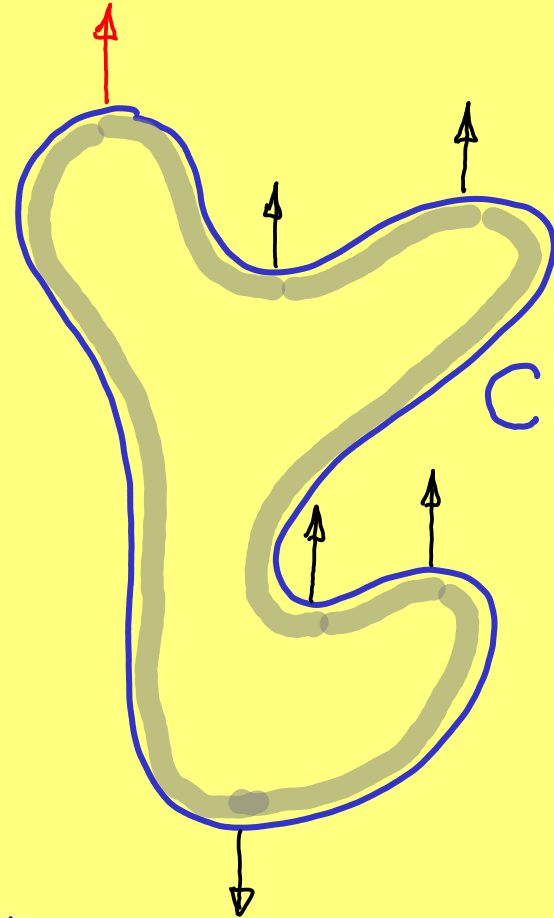
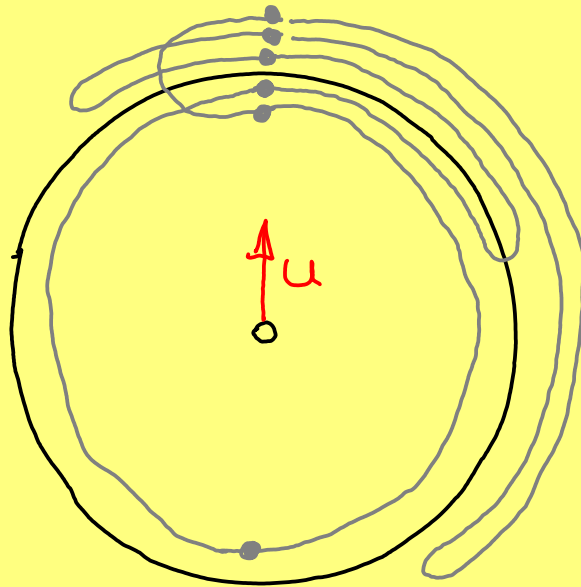
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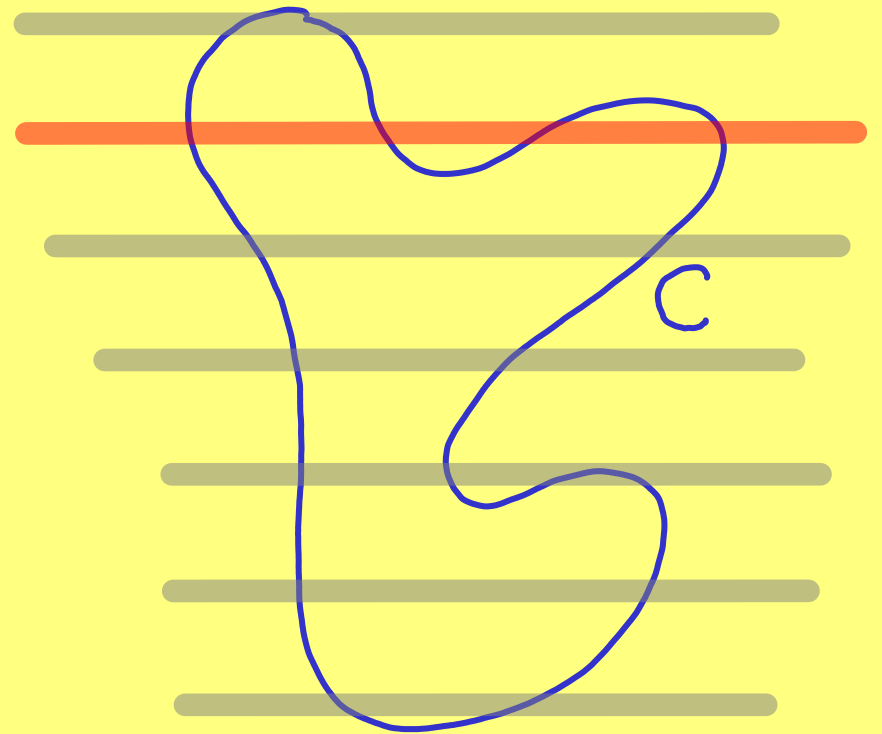


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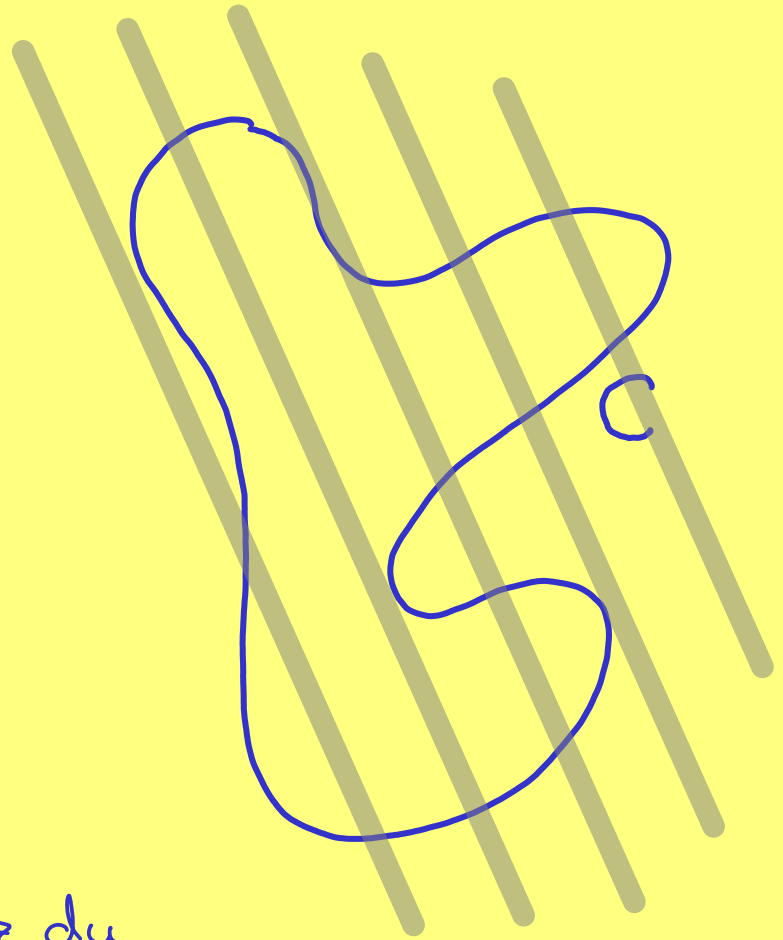
$$\begin{aligned} K(C) &= \int_{x \in C} |K(x)| dx \\ &= \frac{1}{2} \int_{u \in S^1} (\# \text{crit. pts. of } f_u) du \\ &= \int_{u \in S^1} |D_{\text{gm}}(f_u)| du \end{aligned}$$

II.3 LENGTH



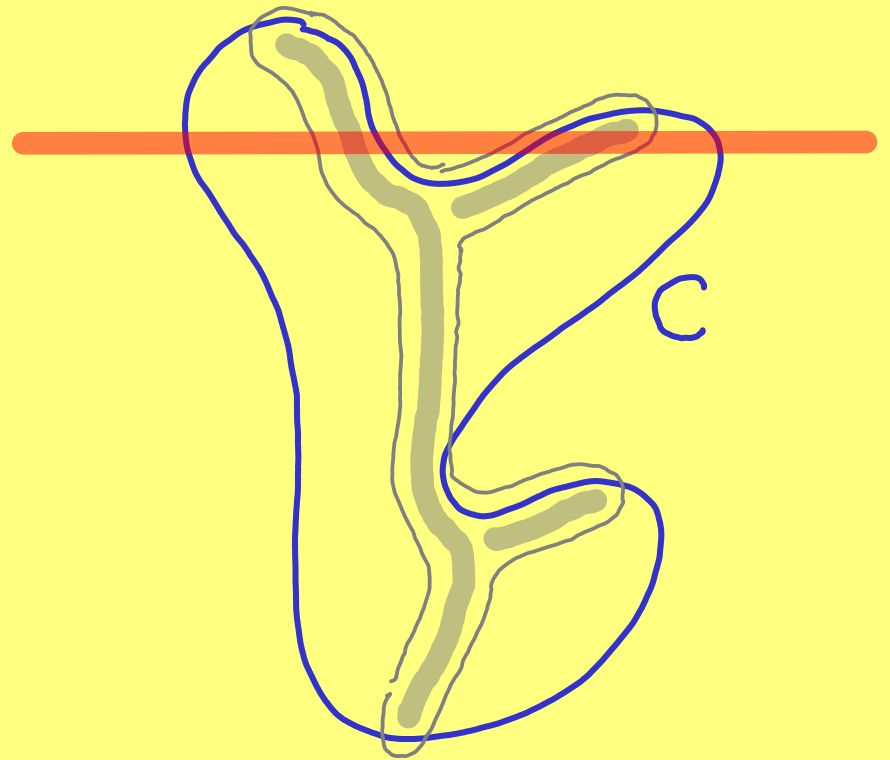
$$L(C) = \frac{1}{2} \int_u \int_z \#X_{\text{ing}}(z) dz du$$

II.3 LENGTH



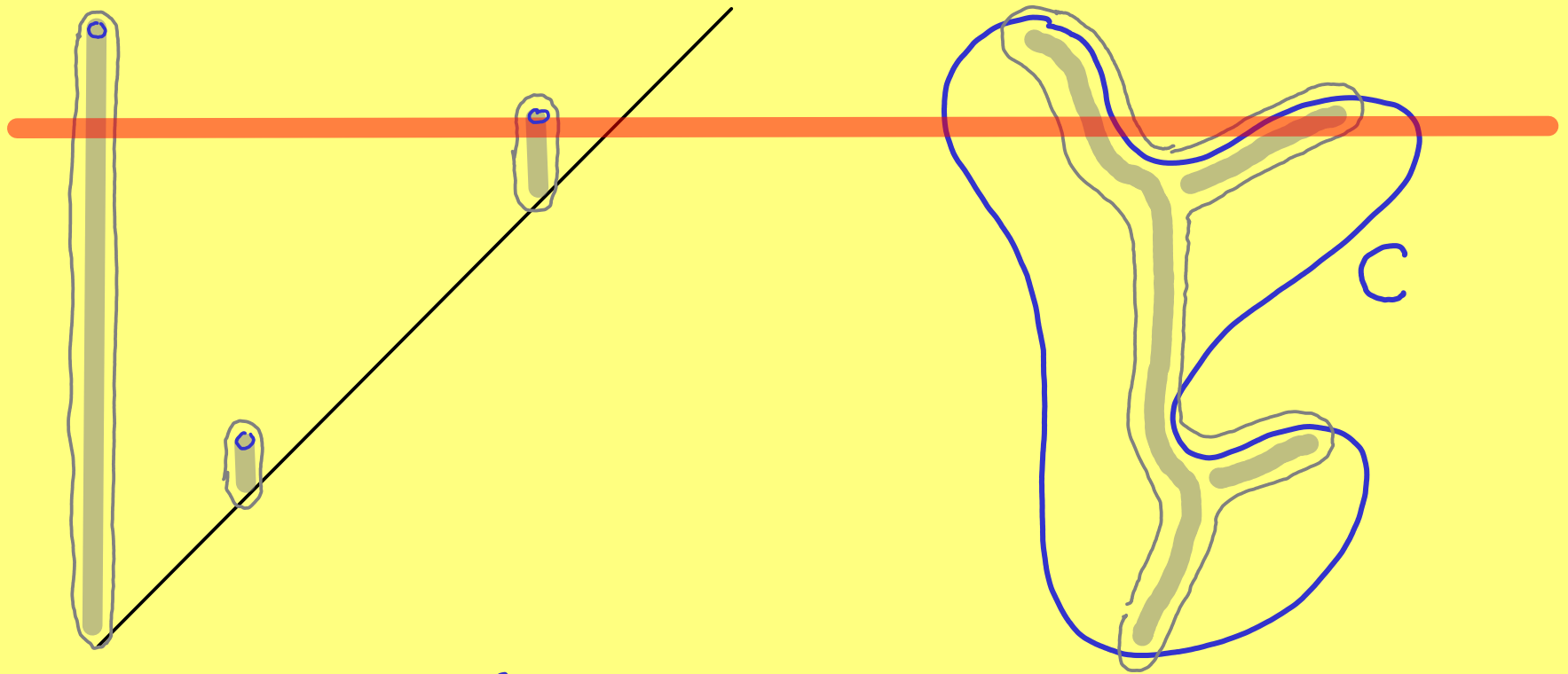
$$L(C) = \frac{1}{2} \int_u \int_z \#X_{\text{int}}(z) dz du$$

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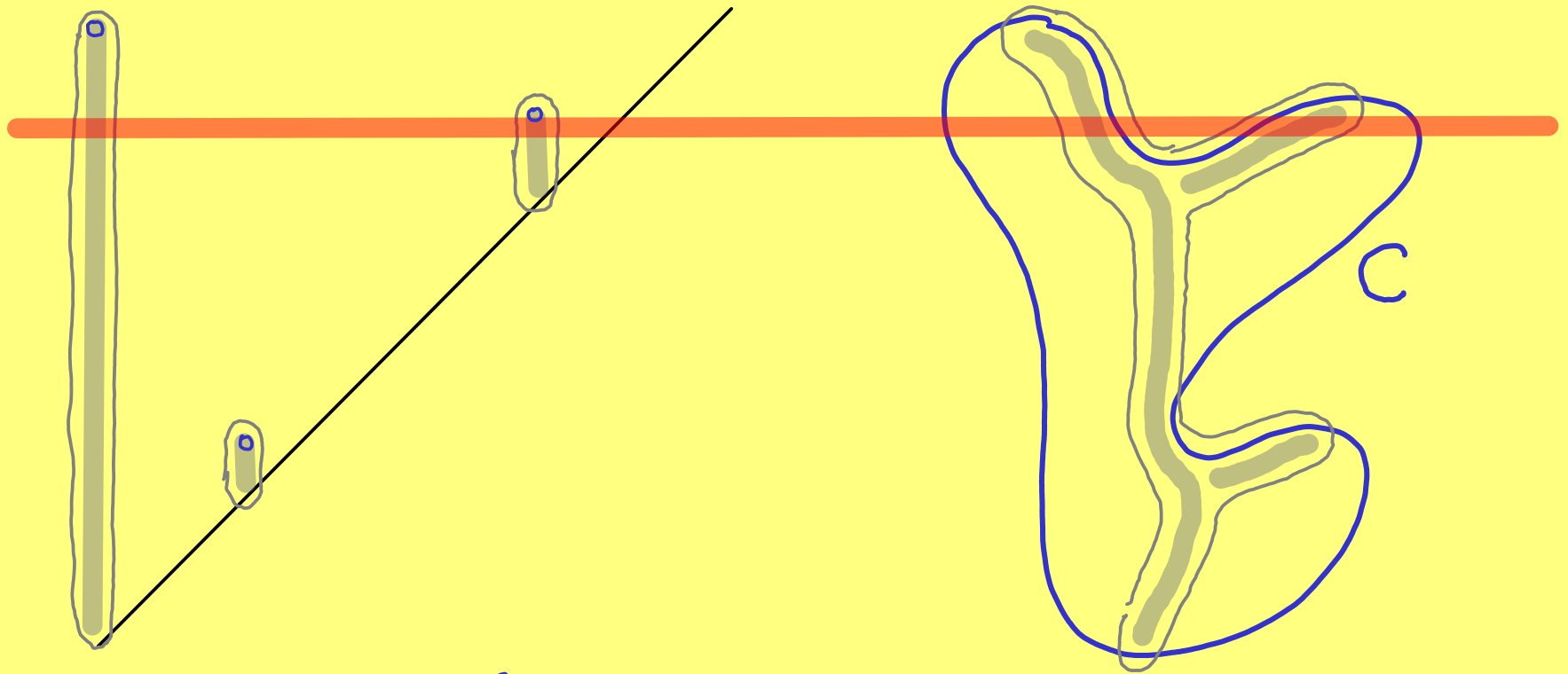
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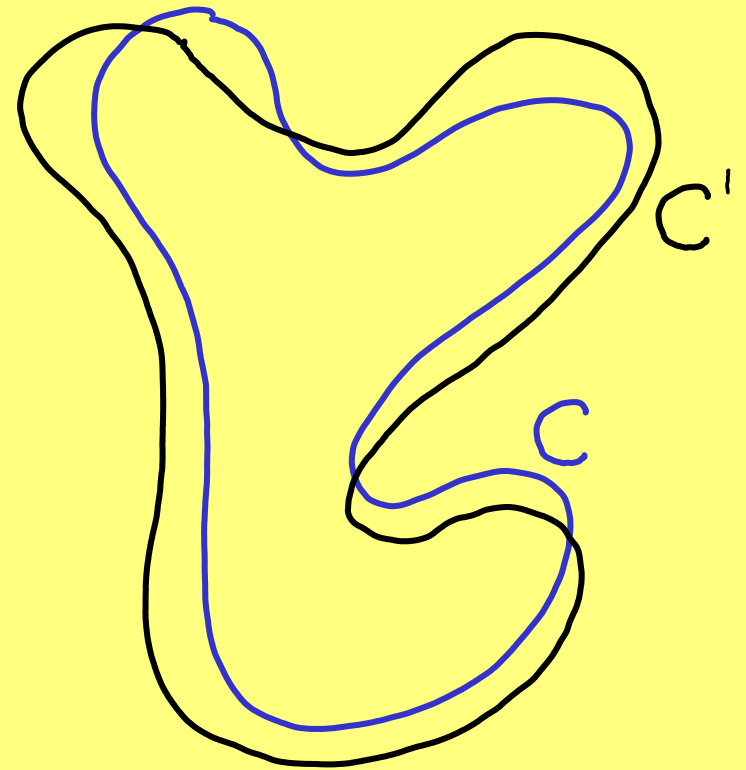
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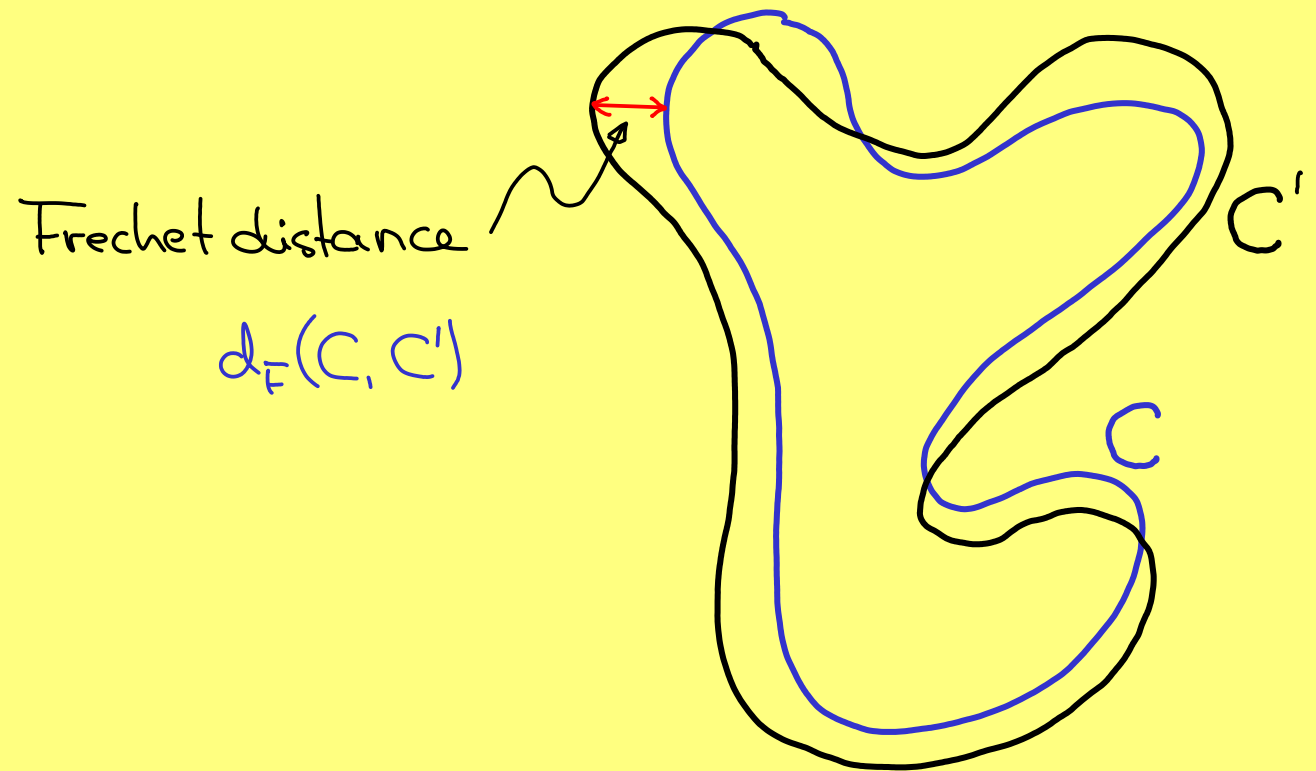
$$L(C) = \frac{1}{2} \int_u \int_z \#X_{\text{ing}}(z) dz du$$

$$= \int_u \sum_{x \in D_{\text{gm}}(f_u)} \text{pers}(x) du$$

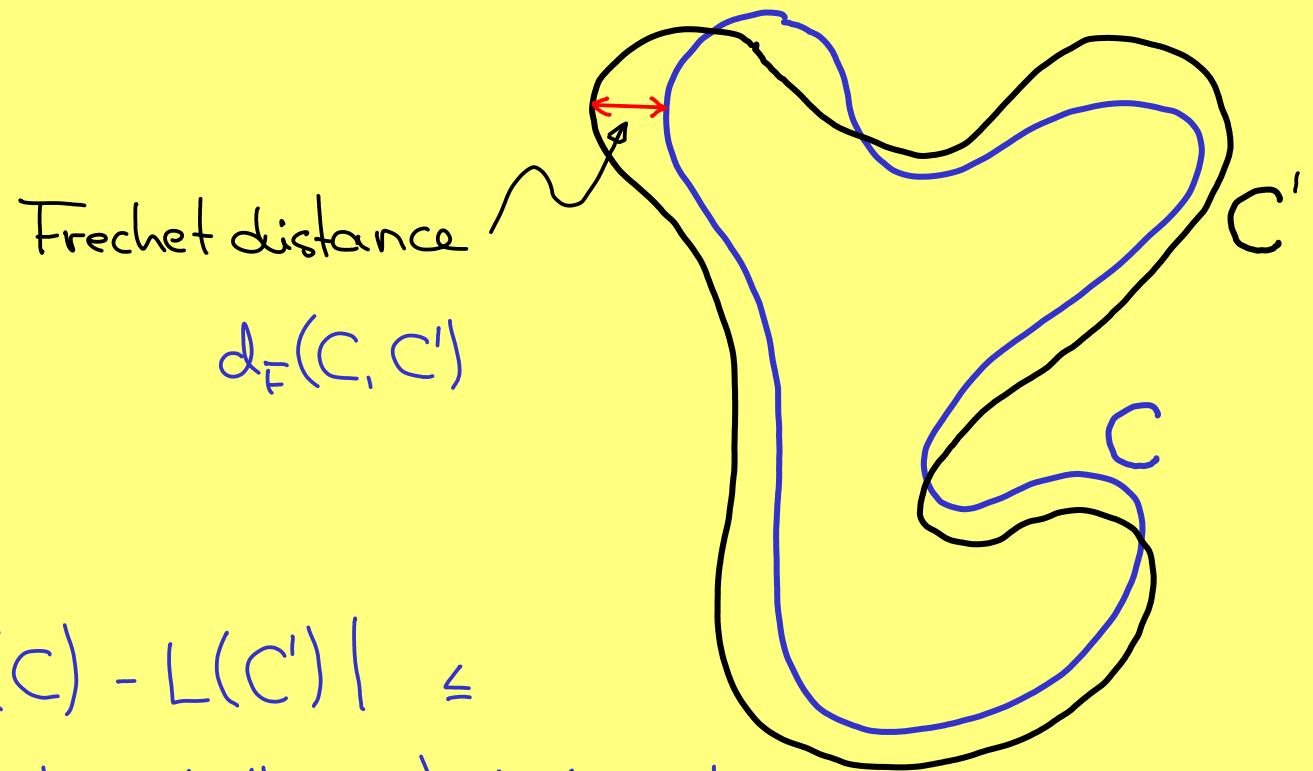
II.4 GENERALIZED FARY THEOREM



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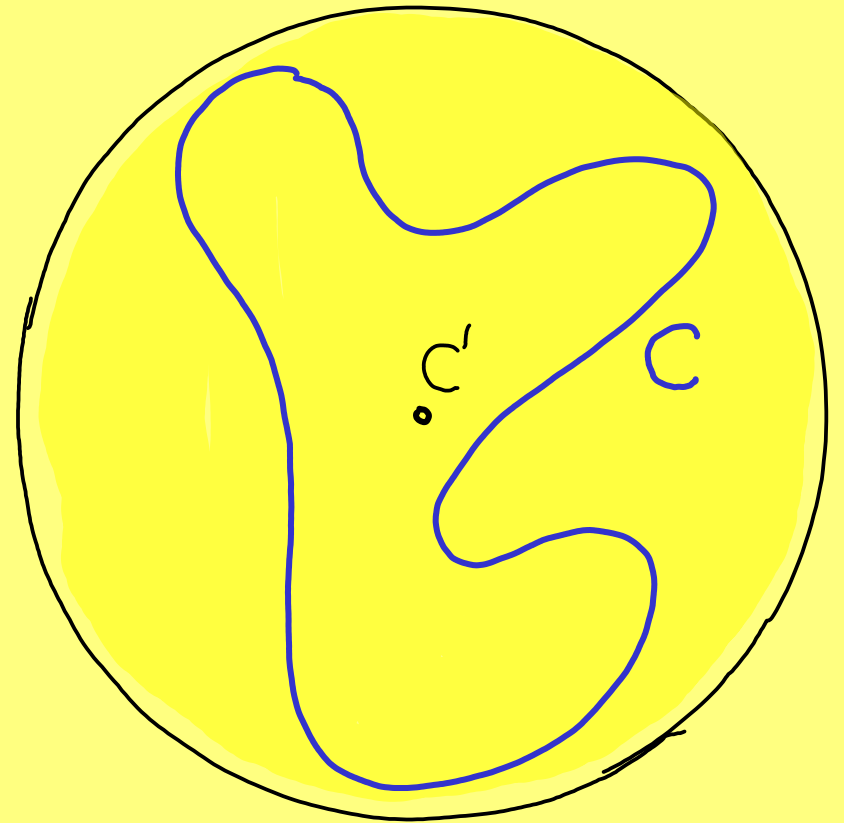


II.4 GENERALIZED FARY THEOREM



THM. $|L(C) - L(C')| \leq$
 $(K(C) + K(C') - 2\pi) d_F(C, C')$.

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III. SOMITES

work by

OLIVIER POURQUIÉ

MARY-LEE DEQUÉANT

III.1 SEGMENTATION of vertebrate body plan

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adult mouse



III.1 SEGMENTATION of vertebrate body plan

adult mouse



mouse embryo



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adult mouse

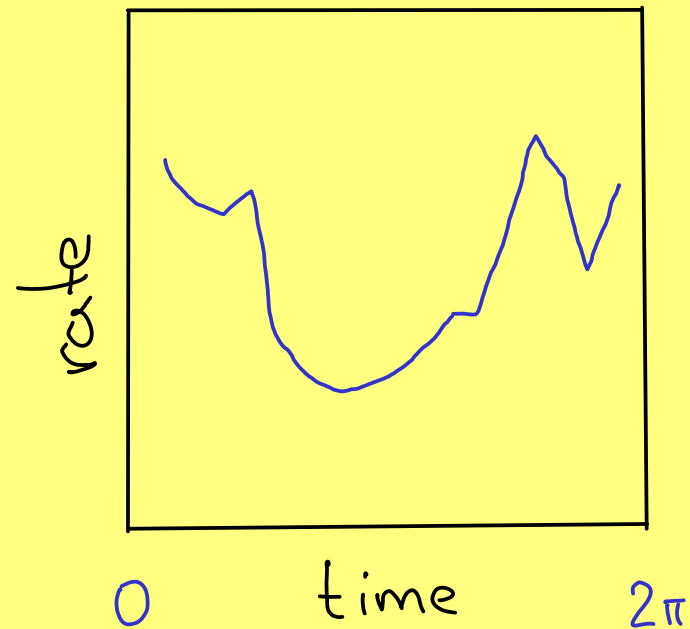


mouse embryo

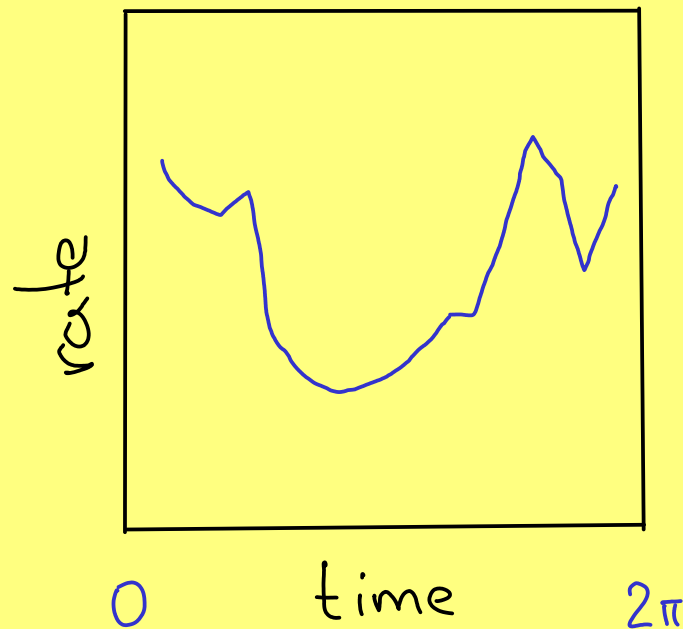


somite development is a rhythmic process

III.2 GENE EXPRESSION DATA



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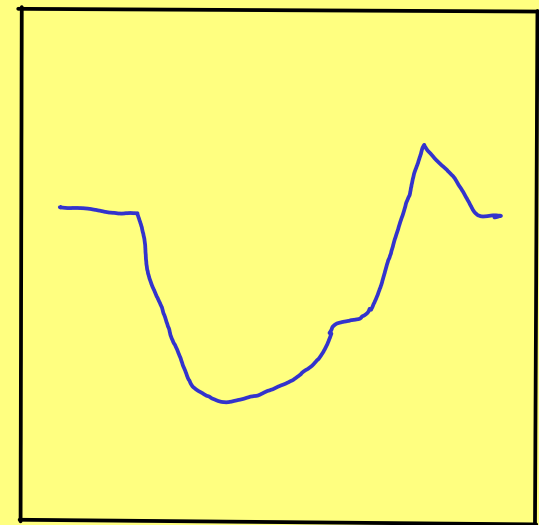
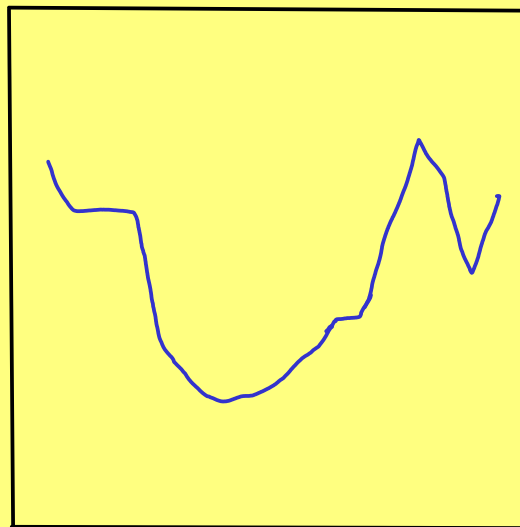
normalized to $\text{amp}(f) = \max_x f(x) - \min_x f(x) = 1$

III.3 SIMPLIFICATION

DEF. An ε -simplification of f is a function $f_\varepsilon: X \rightarrow \mathbb{R}$ with $\|f - f_\varepsilon\|_\infty \leq \varepsilon$ whose diagram $Dgm(f_\varepsilon)$ is same as $Dgm(f)$ without points of persistence at most ε .

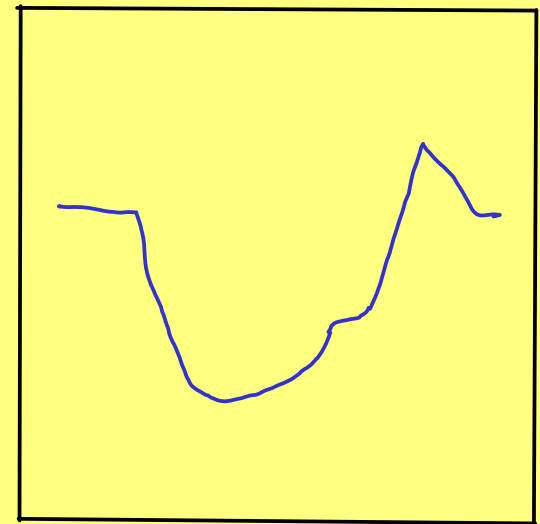
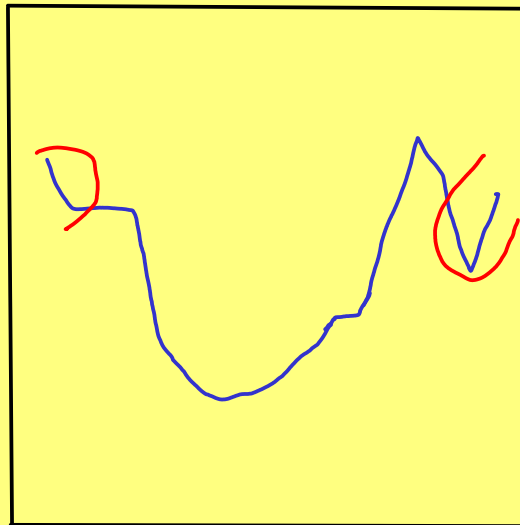
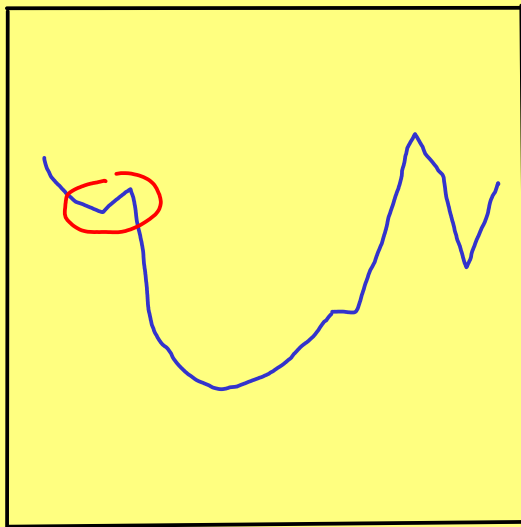
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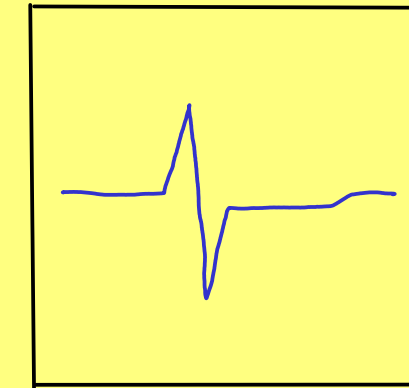
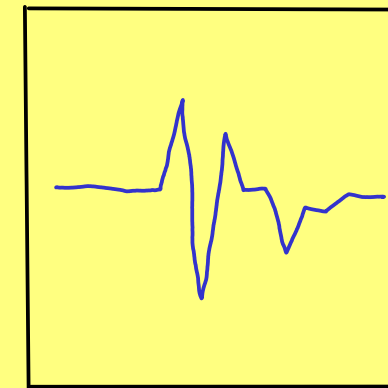
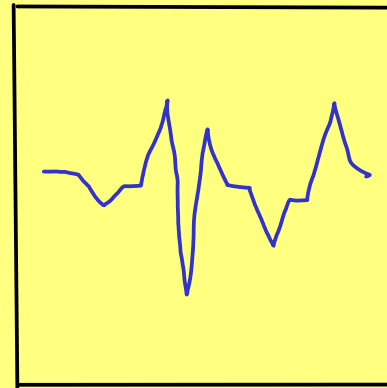
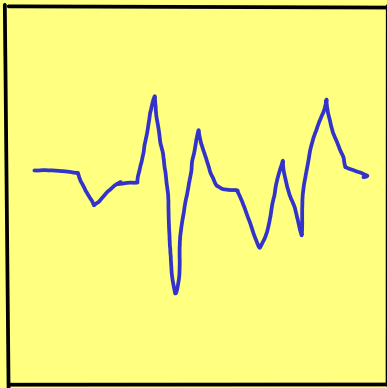
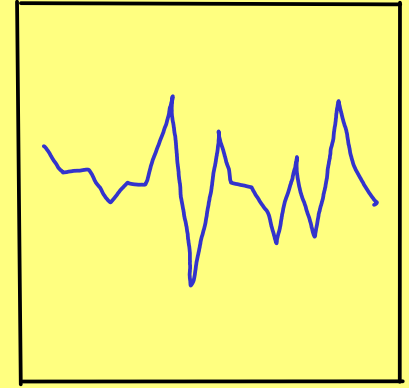
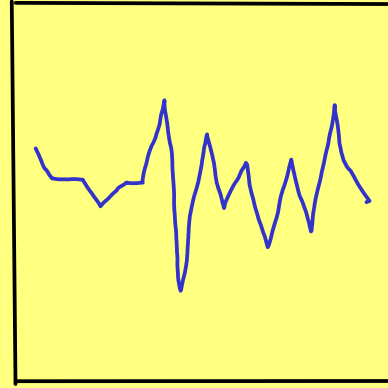
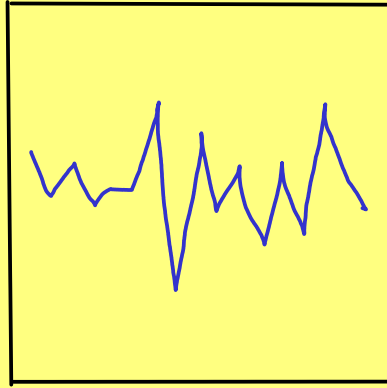
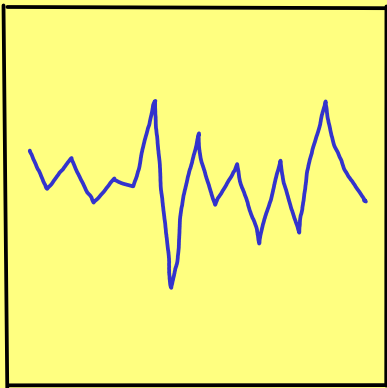


III.3 SIMPLIFICATION

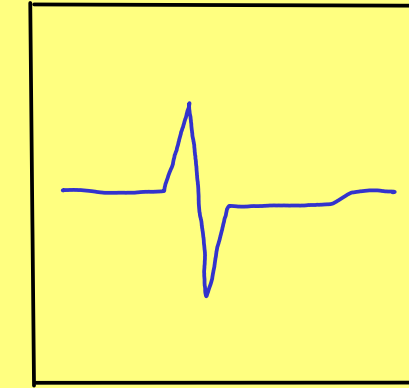
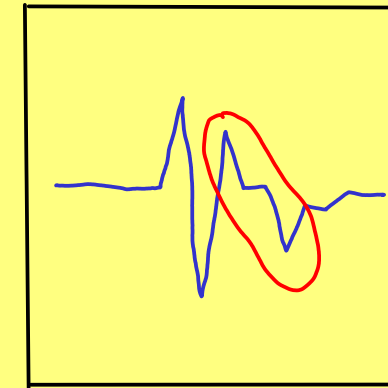
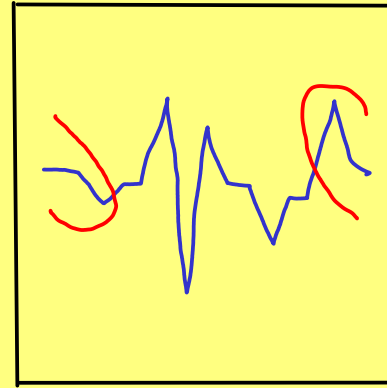
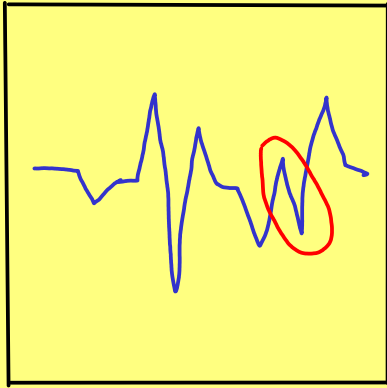
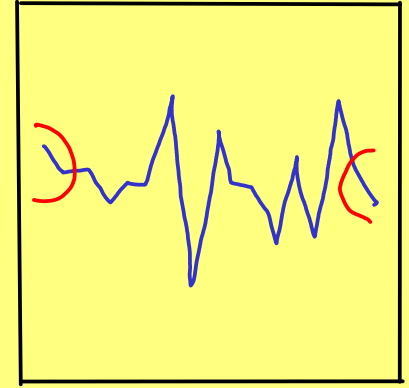
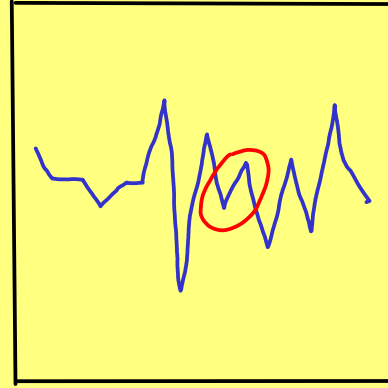
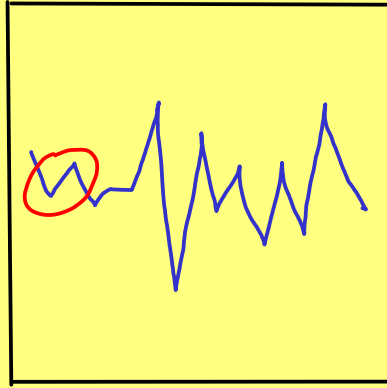
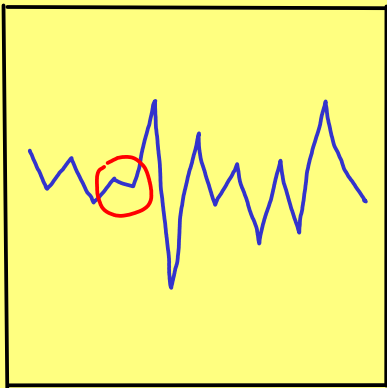
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III.4 MEASURES

$$f: S^1 \rightarrow \mathbb{R}$$

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$$M_0(f) = \frac{1}{2} \# \text{critical points}$$

$$M_1(f) = \int_{\varepsilon=0}^1 M_0(f_\varepsilon) d\varepsilon = \sum_x \text{pers}(x)$$

$$M_2(f) = \int_{\varepsilon=0}^1 M_1(f_\varepsilon) d\varepsilon = \sum_x \text{pers}(x)^2$$

etc.

I.3 L_p -STABILITY

THM. Let X be a compact metric space and $f, g: X \rightarrow \mathbb{R}$ two Lipschitz functions. Then there exist constants k and C that depend on X and the Lipschitz constants of f and g s.t.

$$W_p(f, g) \leq C \|f - g\|_\infty^{p-k}$$

for every $p \geq k$.

I.3 L_p -STABILITY

$$X = S^1 \Rightarrow k = 1$$

THM. Let X be a compact metric space and $f, g: X \rightarrow \mathbb{R}$ two Lipschitz functions. Then there exist constants k and C that depend on X and the Lipschitz constants of f and g s.t.

$$W_p(f, g) \leq C \|f - g\|_\infty^{p-k}$$

for every $p \geq k$.

III.4 MEASURES

$$f: S^1 \rightarrow \mathbb{R}$$

not stable

$$\left\{ \begin{array}{l} M_0(f) = \frac{1}{2} \# \text{critical points} \\ M_1(f) = \int_{\varepsilon=0}^1 M_0(f_\varepsilon) d\varepsilon = \sum_x \text{pers}(x) \end{array} \right.$$

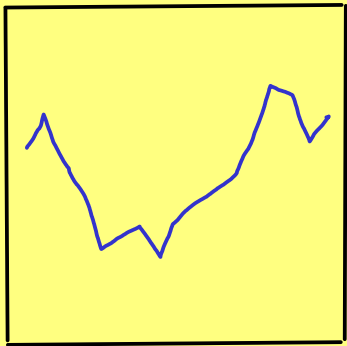
stable

$$\left\{ \begin{array}{l} M_2(f) = \int_{\varepsilon=0}^1 M_1(f_\varepsilon) d\varepsilon = \sum_x \text{pers}(x)^2 \\ \text{etc.} \end{array} \right.$$

III.5 RESULTS

using 30 genes biologically confirmed
to participate in somitogenesis

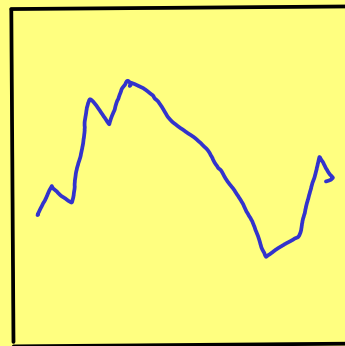
Dkk1	Tnfrsf19	Hes1	Axin2	Hspg2
Myc	Hes5	Dact1	Sp5	Efna1
Bcl2l1	α -Tnfrsf19	Lfng	Spry2	Klf10
s-Dsp	Hey1	Pexdc2	Nudt13	Bcl9e
Id1	Has2	5-Nrarp	Dsp	Phlda1
Arfe4	Nkd1	6-Nrarp	x-Cyr61	α -Cyr61



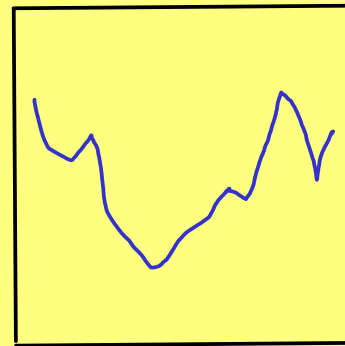
Dkk1



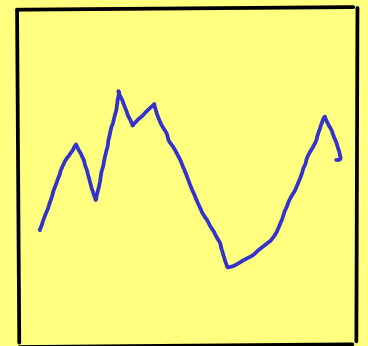
Tnfrsf19



Hles1



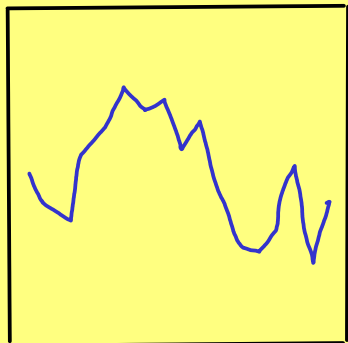
Axin2



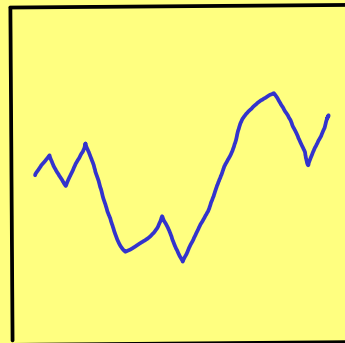
Hspg2



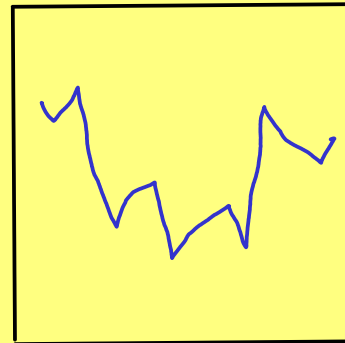
Myc



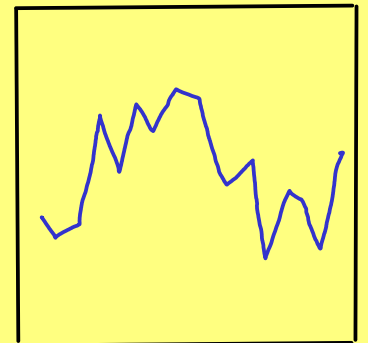
Hles5



Dact1



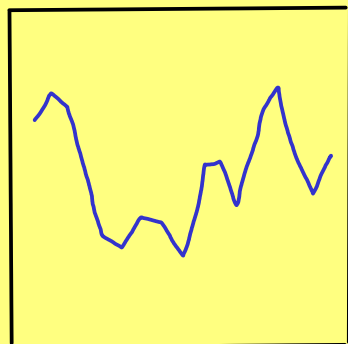
Sp5



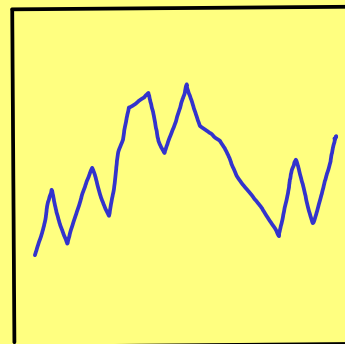
Efna1



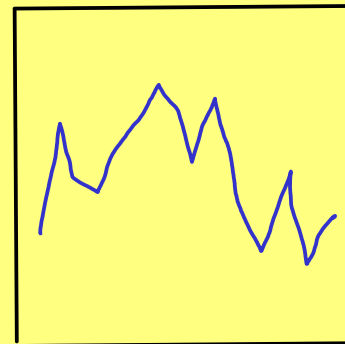
Bcl2l1



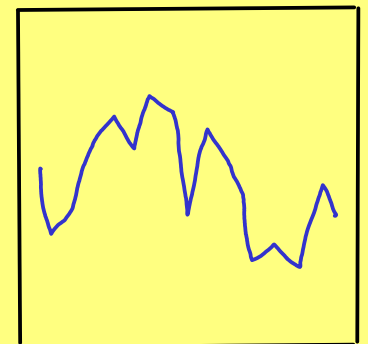
α -Tnfrsf19



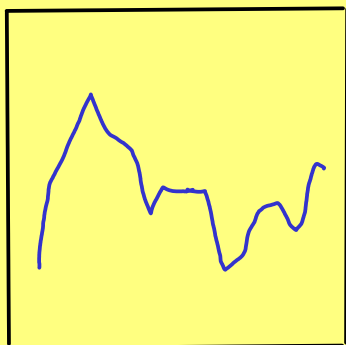
Lnfg



Spry2



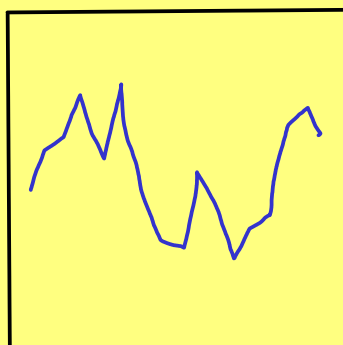
Klf10



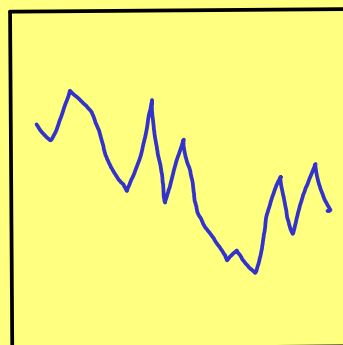
s-Dsp



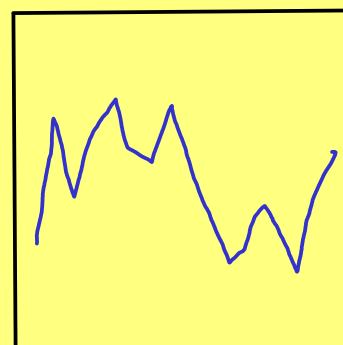
Hey1



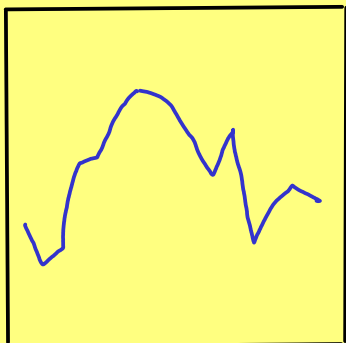
Pexdc2



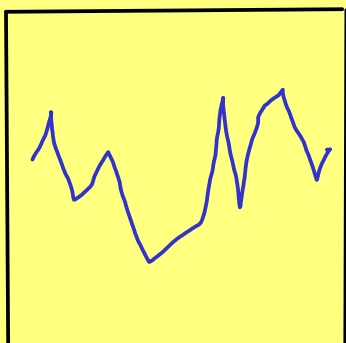
Nudt13



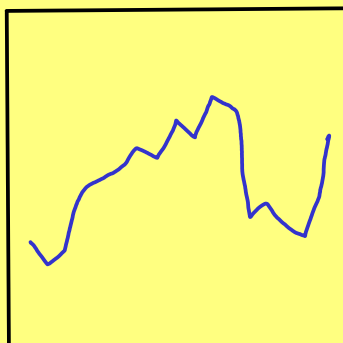
Bcl91



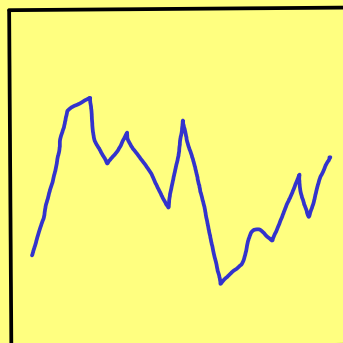
Id1



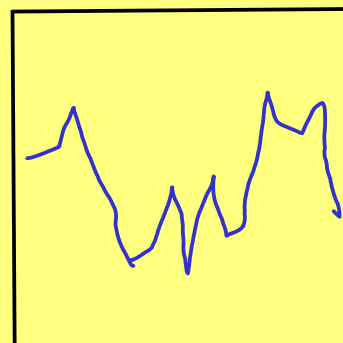
Has2



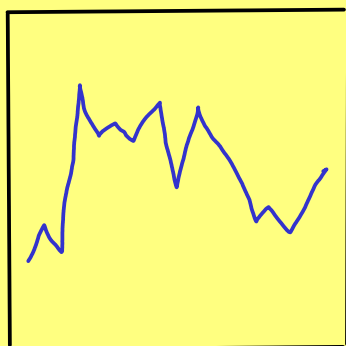
5-Nrarp



Dsp



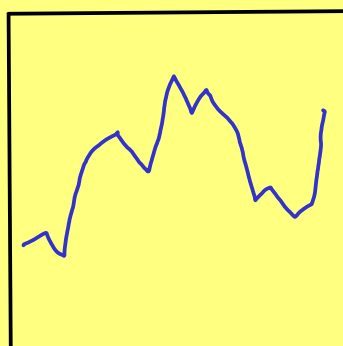
Phlda1



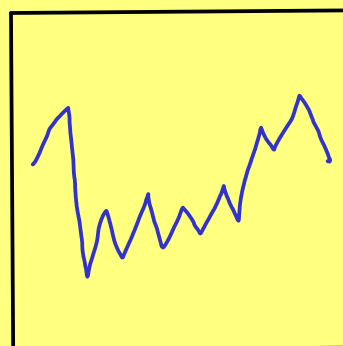
Arfe4



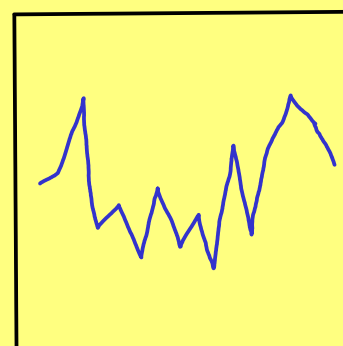
Nkd1



6-Nrarp



x-Cyr61



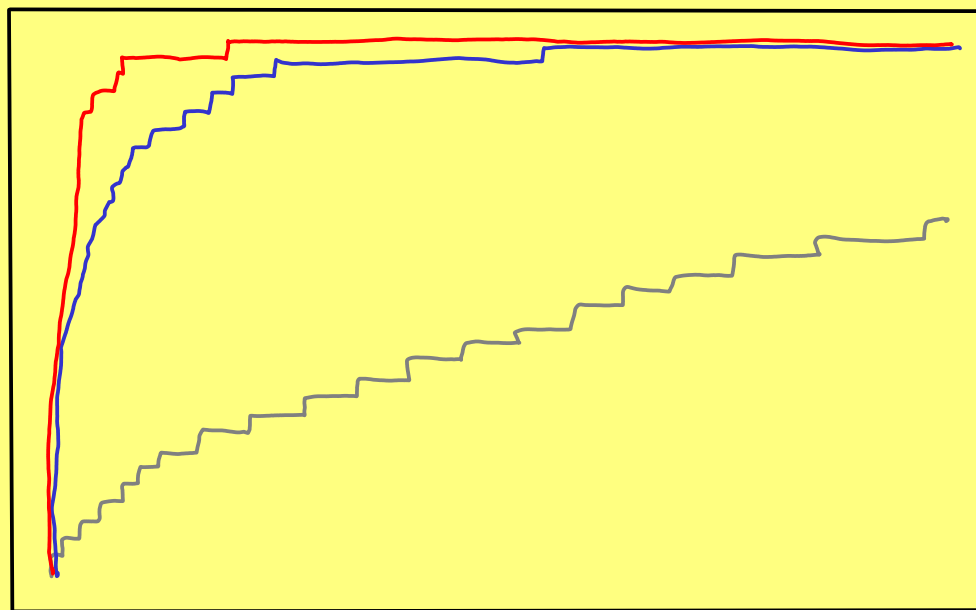
alpha-Cyr61

III.5 RESULTS

	M_1	M_2	M_3	M_4	avg
Dkk1	1	1	1	1	1
Tnfrsf19	12	2	2	2	5
Hey1	23	12	9	9	13
Nudt13	882	170	104	83	310
Arfe4	302	86	74	68	133
...
avg	250	109	104	117	145

III.5 RESULTS

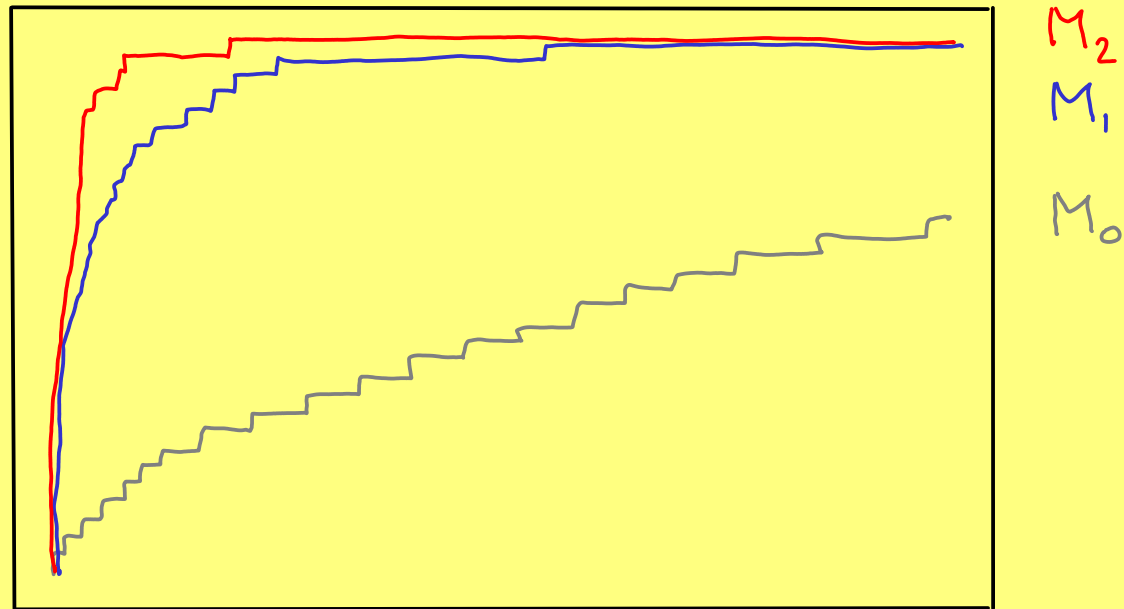
ROC CURVES



M_2
 M_1
 M_0

III.5 RESULTS

ROC CURVES



	M_0	M_1	M_2	M_3	M_4	max
Area	4.42	9.75	10.18	10.19	10.15	10.50

III.5 RESULTS

PROMISING CANDIDATES

	M_1	M_2	M_3	M_4	L
Tnfrsf9	5	4	4	6	8
Ptprn 11	8	6	6	7	22
Mtm 1	9	7	5	3	15
Stom	7	8	12	16	299
Star	6	9	11	13	39
...

IV. MOTION

IV.1 HOMOTOPY

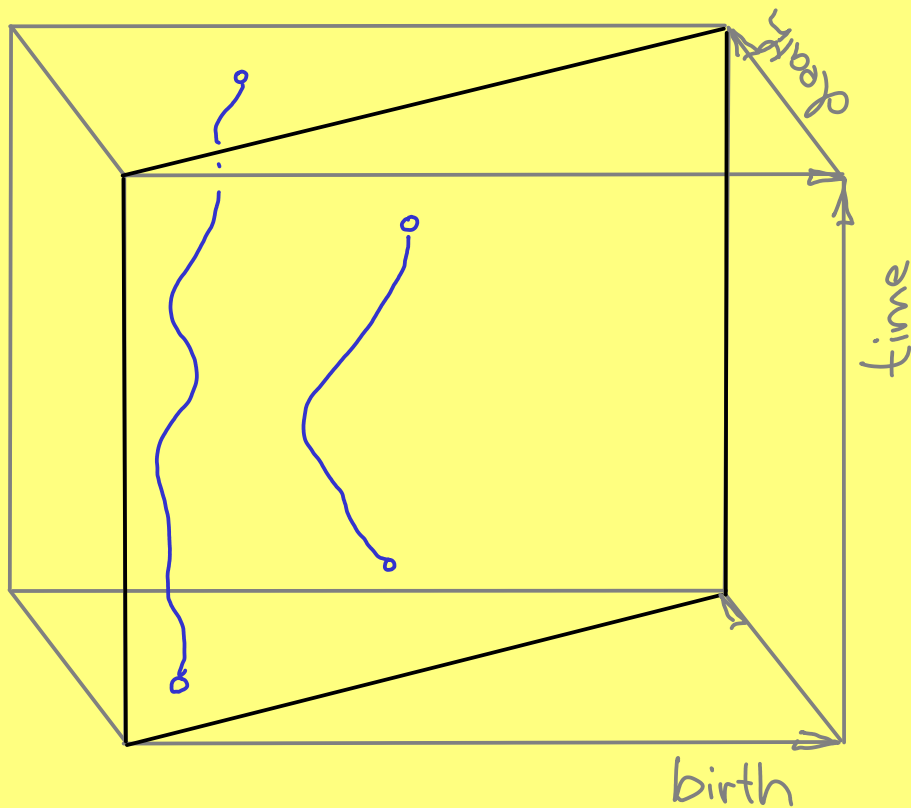
$$F: \mathbb{M} \times [0,1] \rightarrow \mathbb{R},$$

$$f_t(x) = F(x,t) \quad \text{leads to} \quad \text{Dgm}(f_t)$$

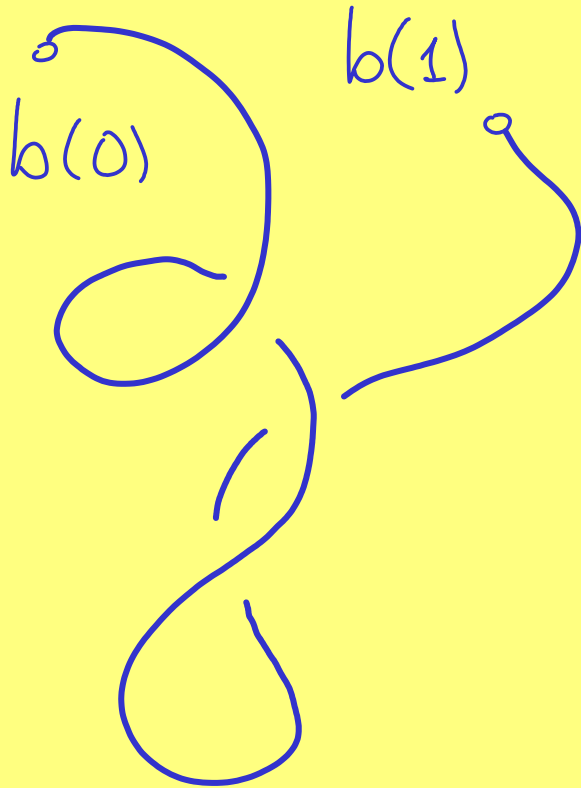
IV.1 HOMOTOPY

$$F: M \times [0,1] \rightarrow \mathbb{R},$$

$f_t(x) = F(x,t)$ leads to $Dgm(f_t)$

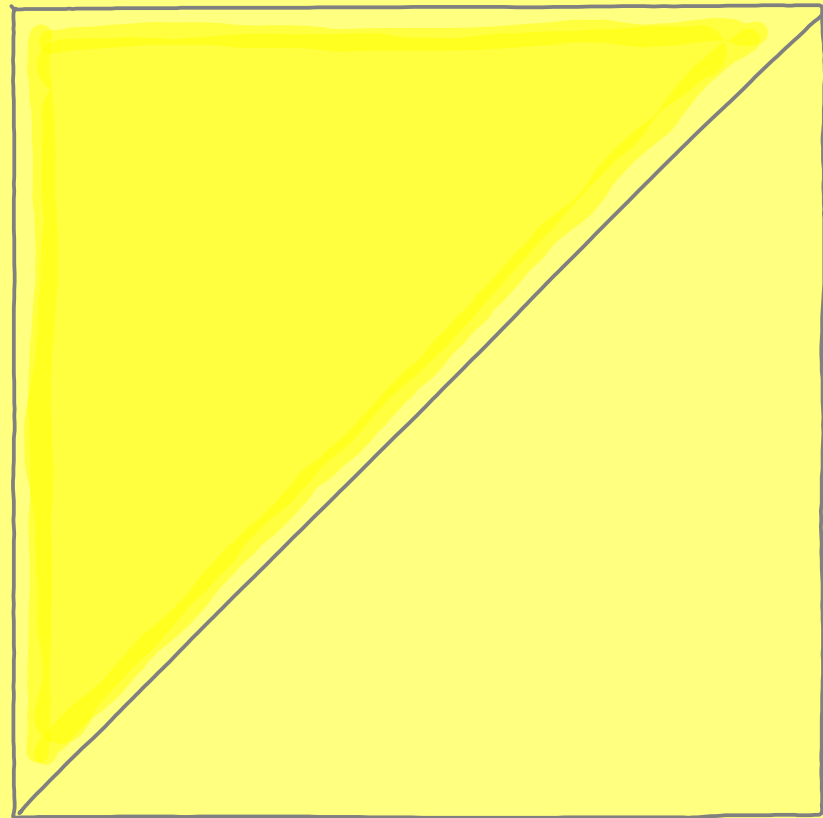
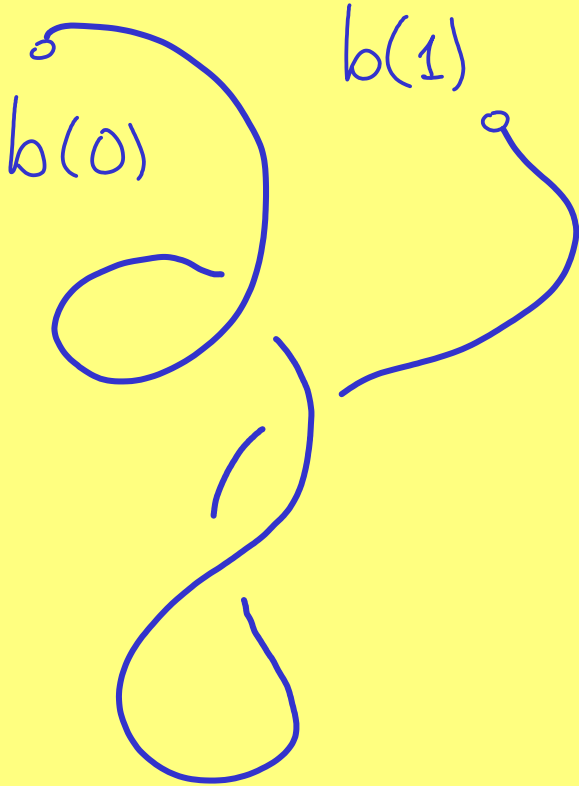


IV.2 PAIRWISE DISTANCE FUNCTION

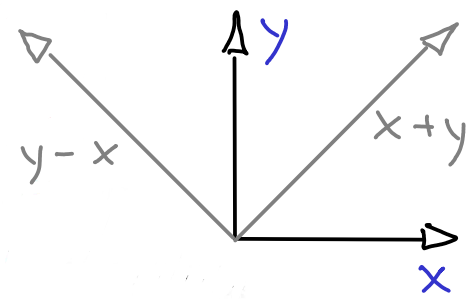
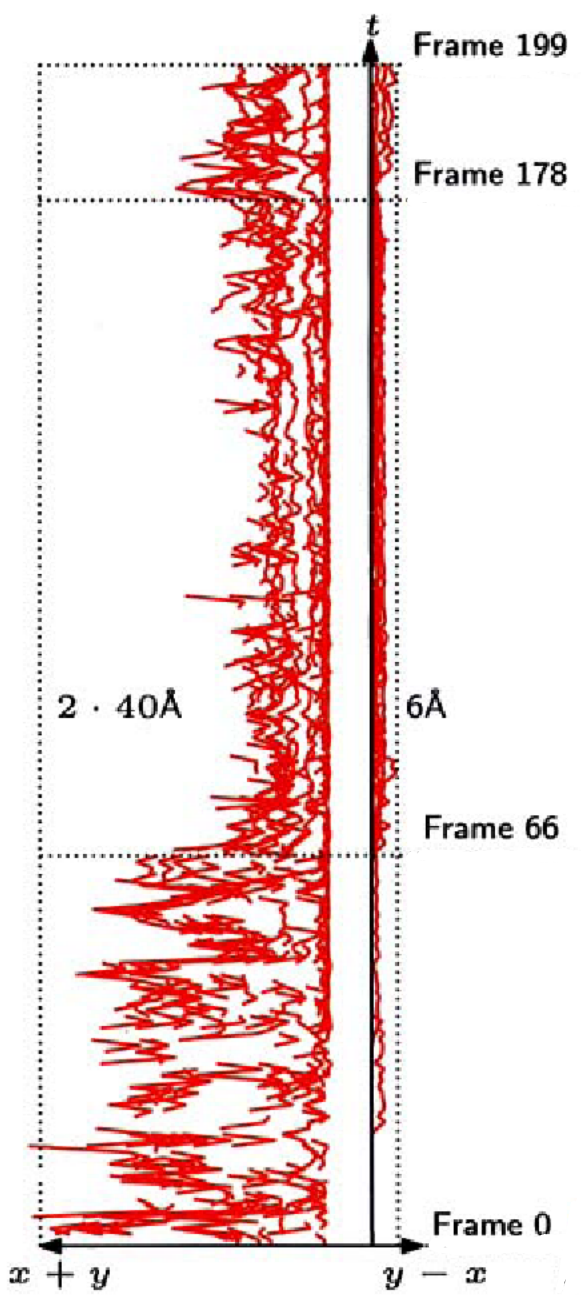


IV.2 PAIRWISE DISTANCE FUNCTION

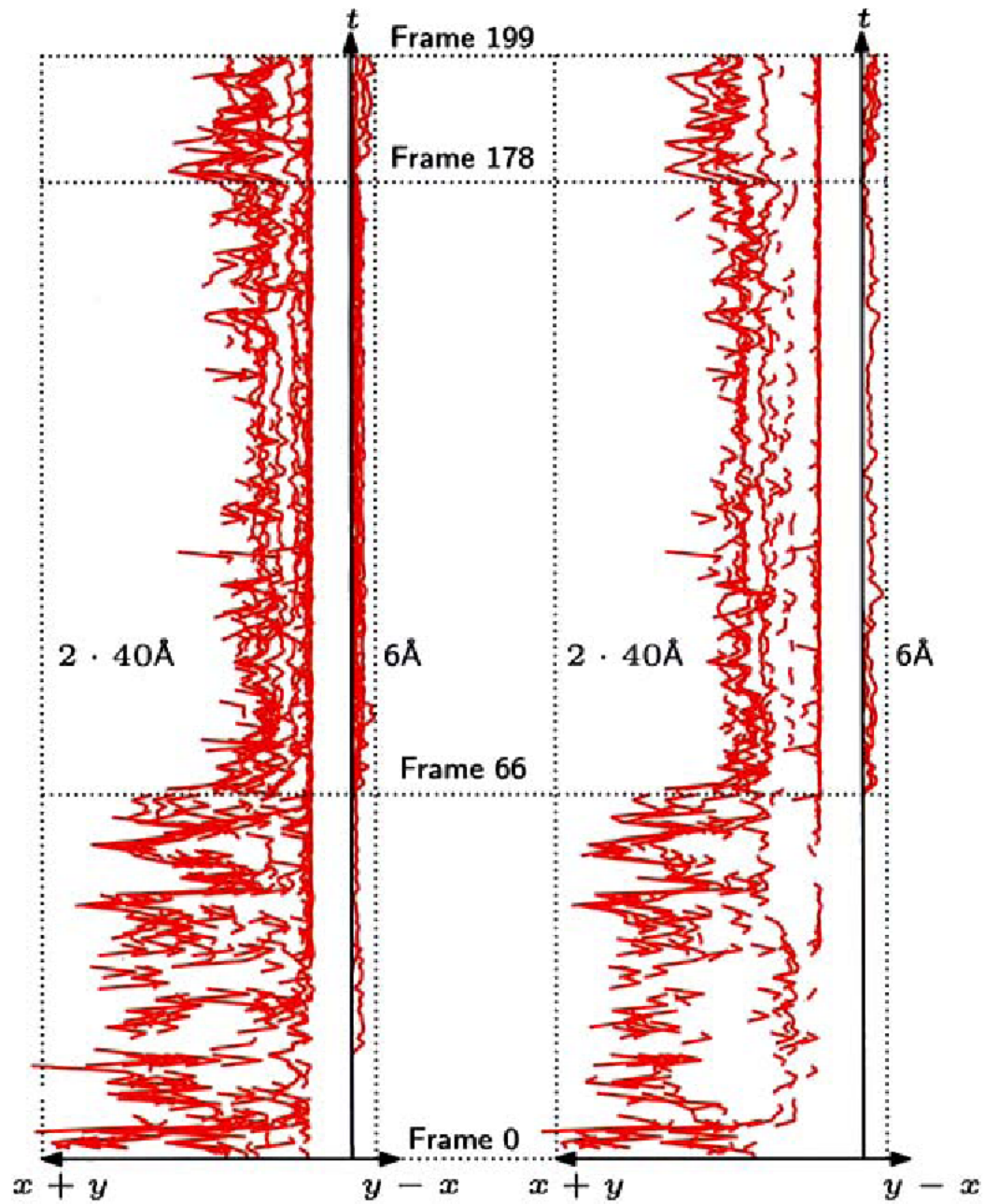
$$f(x,y) = \|b(x) - b(y)\|$$



IV.3 VINEYARD



IV.3 VINEYARD



THANK YOU