

TDA - fall 2025

Vineyards &  
time-varying  
data



# Recap

- Final project proposals - due this week (slot coming soon)
- Office hours today, 2-3pm, if you have any questions
- Older assignments - please submit ASAP

# Stability of Persistence

Previously, we saw several notions of stability, i.e.:

Fix a triangulable space  $X$  with 2 continuous, tame functions  $f, g: X \rightarrow \mathbb{R}$ ,

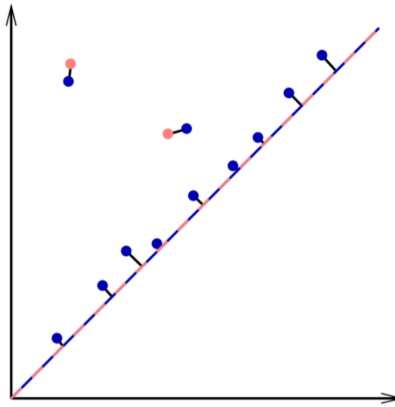
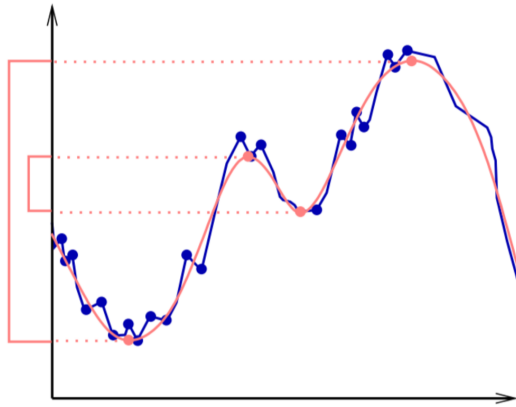
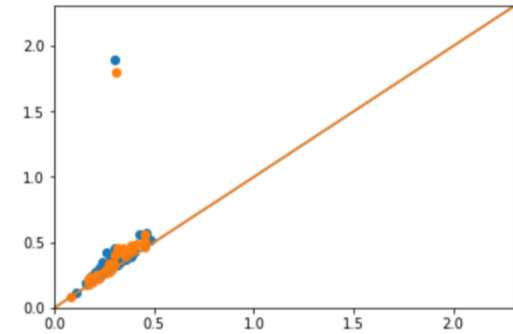
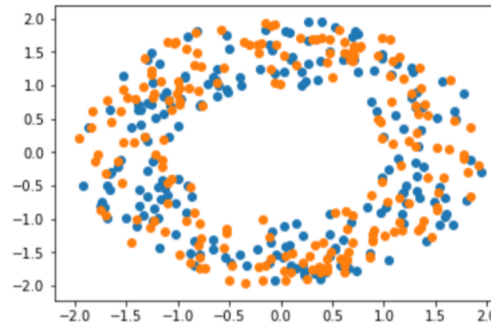
→ & let  $D_f$  &  $D_g$  be the resulting sublevel set persistence diagrams.

Then:  $B(D_f, D_g) \leq \|f - g\|_\infty$

(similar statements for point clouds)

↳ Rips or Cech filtrations

# Pictures

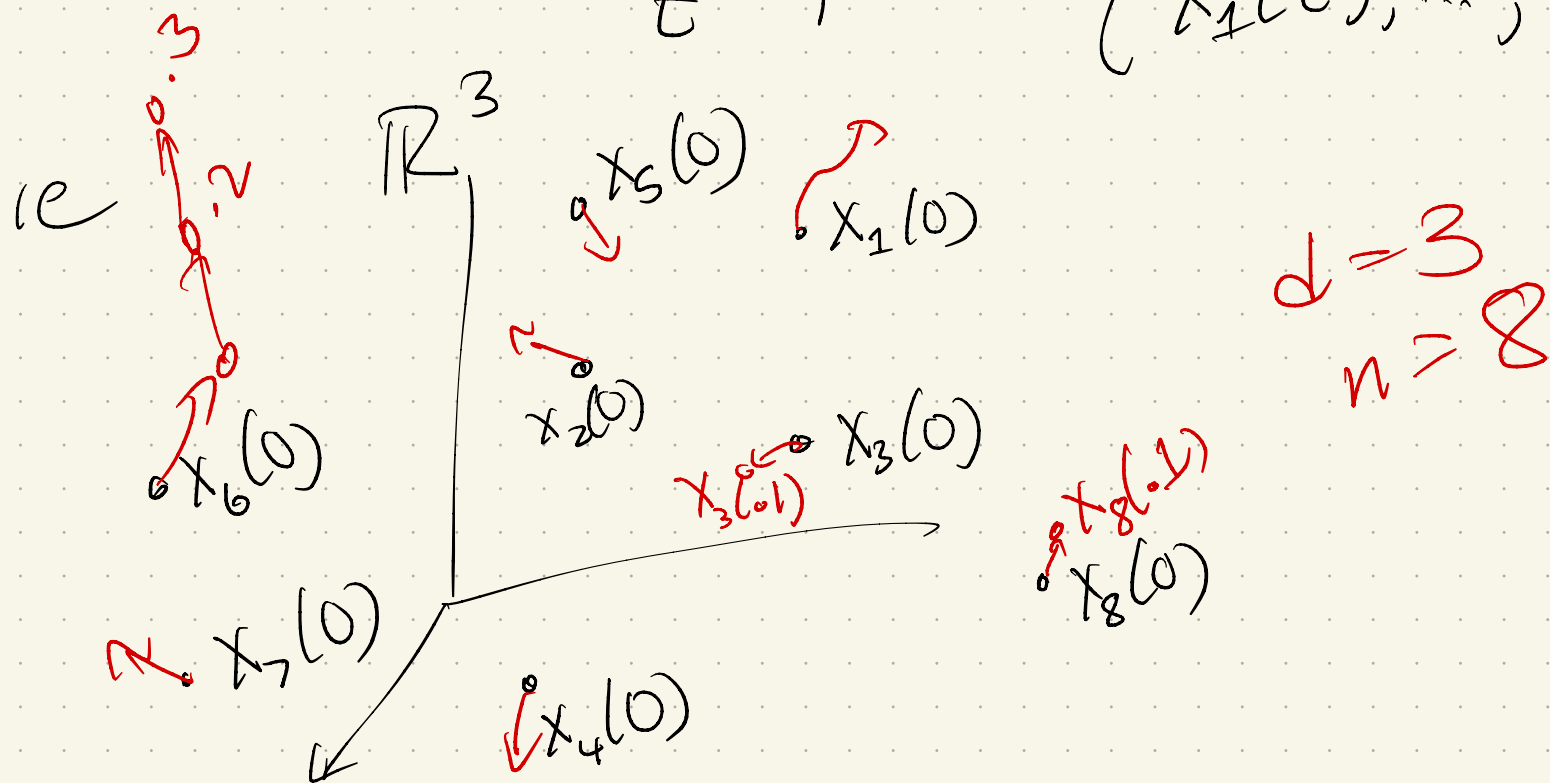


There are many notions of stability,  
but almost all result in an  
explicit map from  $D_g$  to  $D_f$   
(where points on the diagonal are also  
used).



# Time varying point clouds

A dynamic point cloud  $X(t) = (x_1(t), \dots, x_n(t))$  is a point cloud which is moving continuously, for  $t \in [0, 1]$ ,  
ie  $[0, 1] \rightarrow (\mathbb{R}^d)^n$   
 $t \mapsto (x_1(t), \dots, x_n(t))$



# Vineyards

Cohen-Steiner, Edelsbrunner, Morozov  
2006

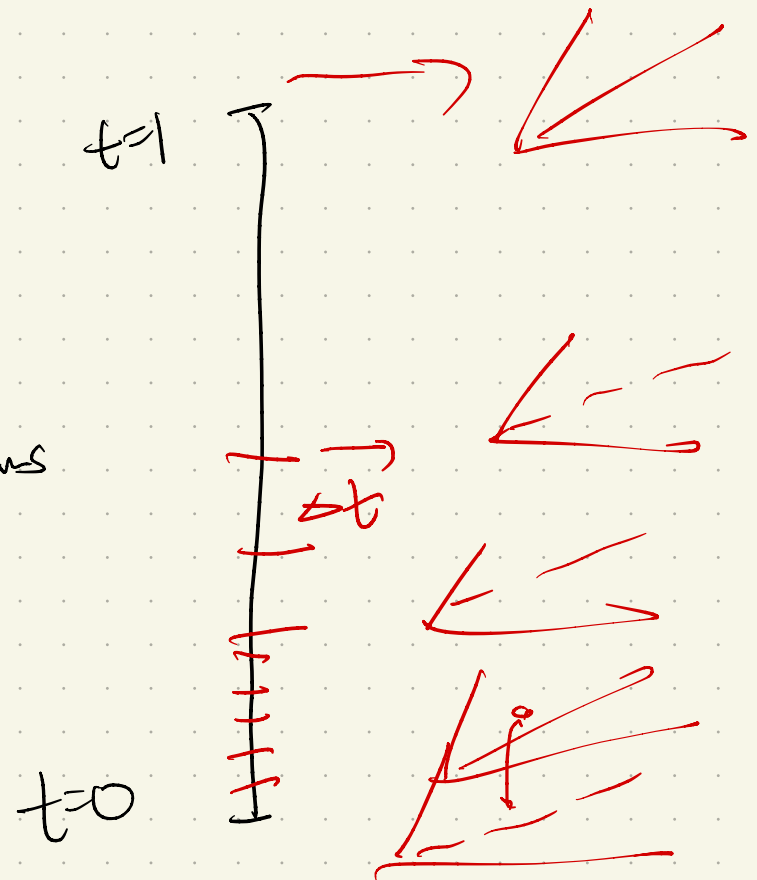
For each time  $t$ , we have a persistence diagram  $D(X(t))$ .

This one parameter family is called a vineyard:

$$V(X) = \{D(X(t)) \mid t \in [0, 1]\}$$

$$[0, 1] \rightarrow \mathbb{D} \quad \leftarrow \begin{array}{l} \text{space of} \\ \text{pers. diagrams} \end{array}$$

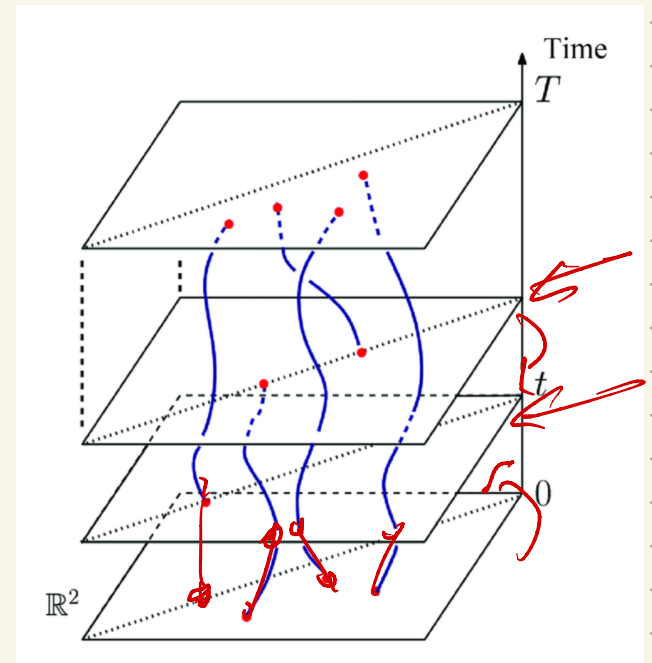
$$t \mapsto D(X(t))$$



If the dynamic point set  $X(t)$  is continuous with respect to Hausdorff distance, the Vineyard is continuous with respect to bottle neck distance.

Why? stability!

Vine: trace of some off-diagonal persistence point.

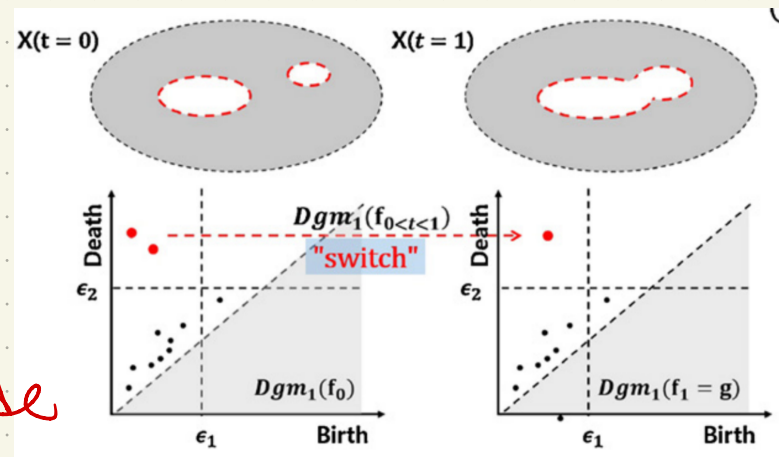


Note: things can appear from diagonal, disappear into diag, & collide

Similarly, consider a simplicial complex  $|K|$  with 2 functions  $f, g: |K| \rightarrow \mathbb{R}$  & any homotopy  $f_t$  interpolating from  $f = f_0$  to  $g = f_1$  (with each  $f_t$  tame).  
 Vines are smooth except where critical pairs change

↳ called knees.

How? places where birth/death times coincide



## Aside on vines

Not clear if arbitrary vineyards  
can decompose nicely into vines.

Munch 2013

Turner 2023

(mostly because of diagonal & knees)

Nonetheless, computation & statistics  
for vineyards are well-studied.

# Computation

Cohen-Steiner et al 2006

For triangulation  $K$  of space  $X$  with monotone function  $f$ , recall our matrix algorithm:

$R = B$

for  $j = 1 \dots m$  do

→ while  $\exists j' < j$  with  $\text{low}(j') = \text{low}(j)$  do  
add column  $j'$  to column  $j$

end while

end for

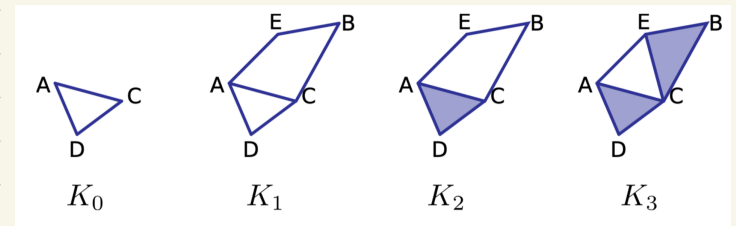
|     | A | C | D | AC | CD | AD | E | B | AE | BE | BC | ACD | CE | BCE |
|-----|---|---|---|----|----|----|---|---|----|----|----|-----|----|-----|
| A   |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| C   |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| D   |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| AC  |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| CD  |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| AD  |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| E   |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| B   |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| AE  |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| BE  |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| BC  |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| ACD |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| CE  |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| BCE |   |   |   |    |    |    |   |   |    |    |    |     |    |     |

$K_0$

$K_1$

$K_2$

$K_3$



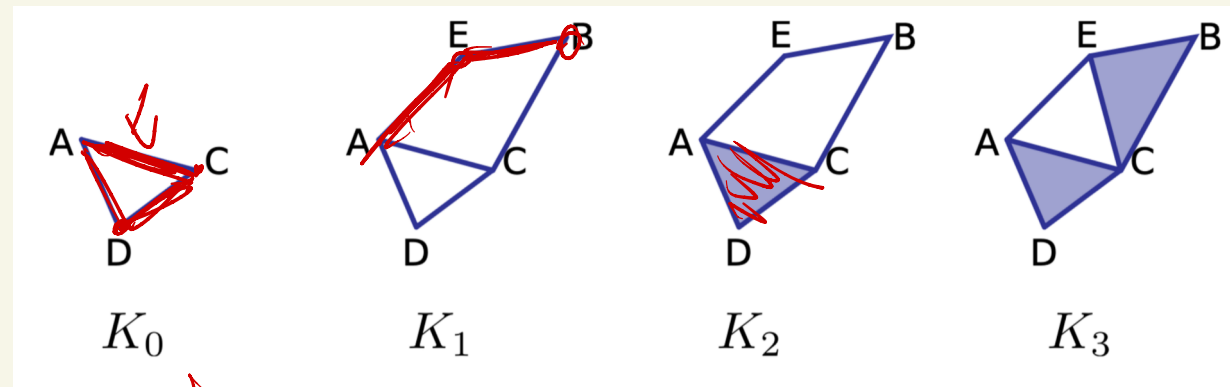
Result: pairs  $(\sigma_i, \sigma_j)$  with  $i = \text{lower}(j)$

*AC, C → CD, D*

|     | A | C | D | AC | CD | AD | E | B | AE | BE | BC | ACD | CE | BCE |
|-----|---|---|---|----|----|----|---|---|----|----|----|-----|----|-----|
| A   |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| C   |   |   |   | *  |    |    |   |   |    |    |    |     |    |     |
| D   |   |   |   |    | *  |    |   |   |    |    |    |     |    |     |
| AC  |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| CD  |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| AD  |   |   |   |    |    |    |   |   |    |    |    | *   |    |     |
| E   |   |   |   |    |    |    |   | * |    |    |    |     |    |     |
| B   |   |   |   |    |    |    |   |   | *  |    |    |     |    |     |
| AE  |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| BE  |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| BC  |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| ACD |   |   |   |    |    |    |   |   |    |    |    |     |    |     |
| CE  |   |   |   |    |    |    |   |   |    |    |    |     |    | *   |
| BCE |   |   |   |    |    |    |   |   |    |    |    |     |    |     |

$\sigma_i$  positive  
 $\sigma_j$  negative

*CR*



Updating the pairing

Suppose order of 2 simplices flip:  
need to update persistence pairs  
(maybe).

Some linear algebra! can rewrite

$$R = \underline{DV}, \quad V \text{ invertible} \quad \& \quad \text{upper-triangular}$$

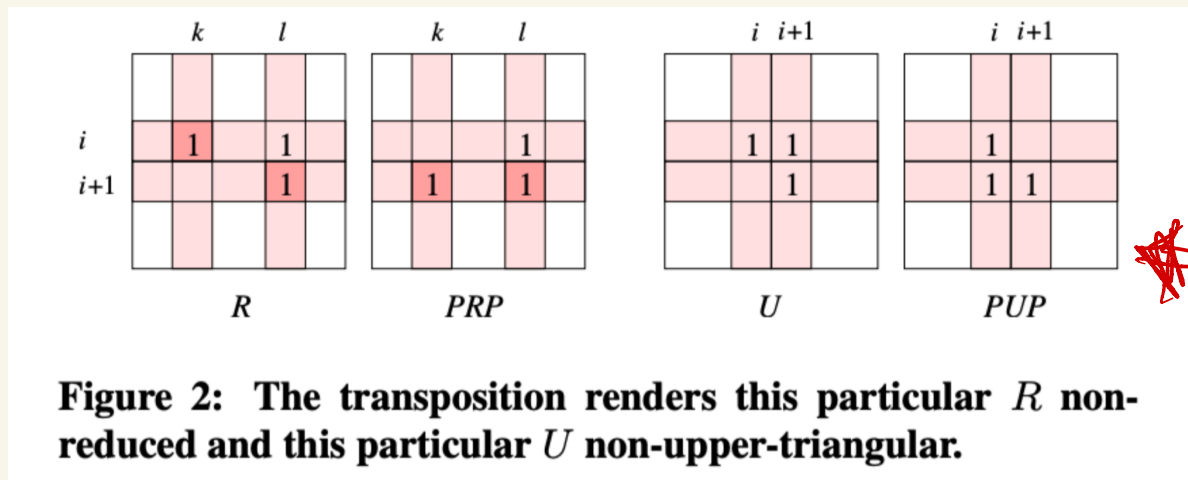
$$\Rightarrow \underline{D} = R(V^{-1}) = R\underline{U}$$

positive simplices  $\rightarrow$  zero columns  $\leftarrow$   
negative  $\rightarrow$  non-zero  $\leftarrow$



# Matrix cases

Swapping  $i$  &  $i+1$  in filtration:  
can cause change in birth/death  
pairs



Worst case update cost:

$O(n)$

(at most the number of  
1's in affected rows  
& columns)

# Initial application

Proteins : curve  $b: [0,1] \rightarrow \mathbb{R}^3$

BBA5 :  $N=23$  amino acids

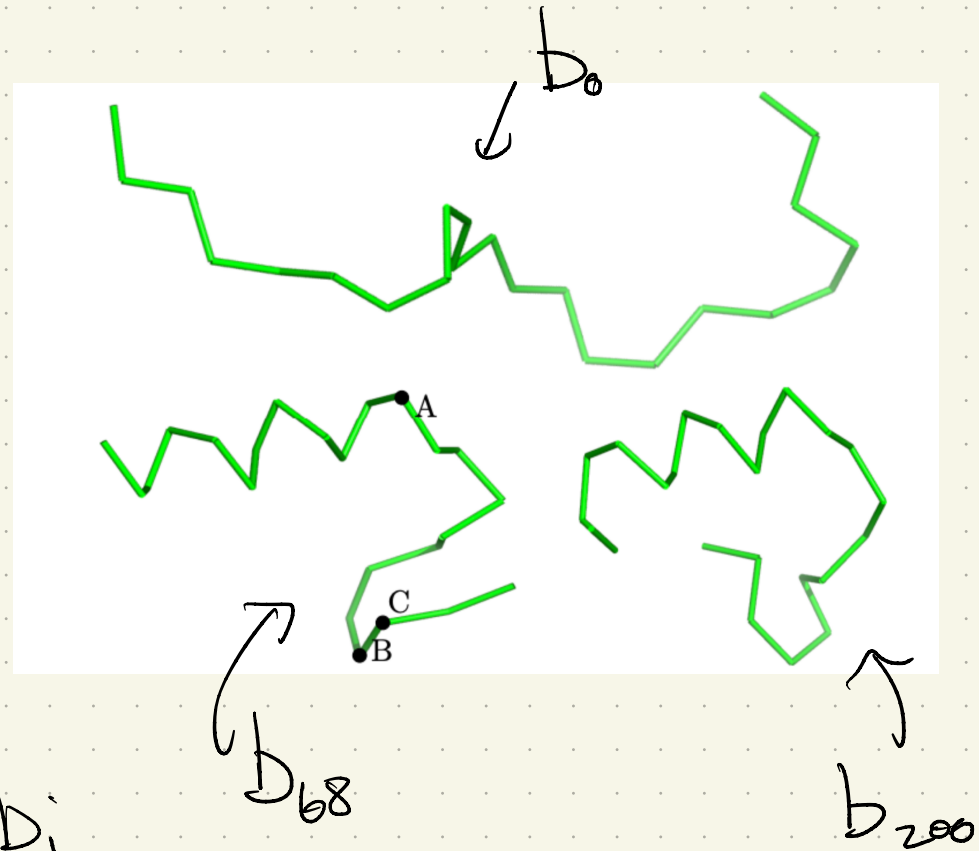
$m+1 = 201$  frames, where  $\forall 0 \leq i \leq m$ ,  
 $i^{\text{th}}$  snapshot is a curve  $b_i$

They define a  
pair wise distance

$[0,1]^2 \rightarrow \mathbb{R}$  with  
 $(r,s) \mapsto \|b(r) - b(s)\|$

on each  $b_i$

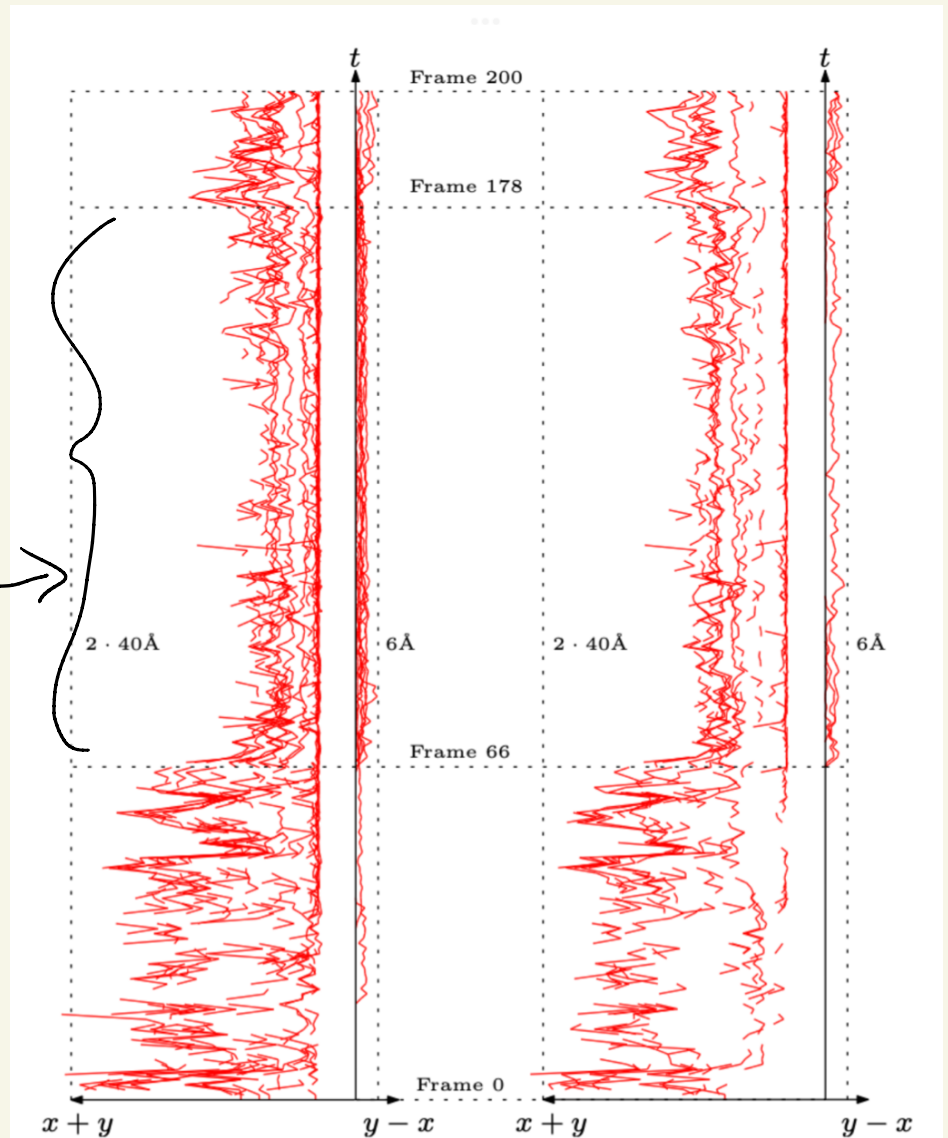
→ build filtration for  $b_i$



Then, build vineyards:

Some what hard to  
parse, but gives  
evidence of stages

2<sup>nd</sup> stage  
 $\alpha$ -helix forms  
& backbone is  
an S-shap  
[59 knees here]



**Figure 8:** The front view ( $x+y, t$ ) and the side view ( $y-x, t$ ) of the dimension 0 vineyard on the left and the dimension 1 vineyard on the right. The side views are simplified by removing vines with lifetime less than 20 frames.

# Another application

Brain connectivity

Yoo, Kim, Ahn, Ye 2016

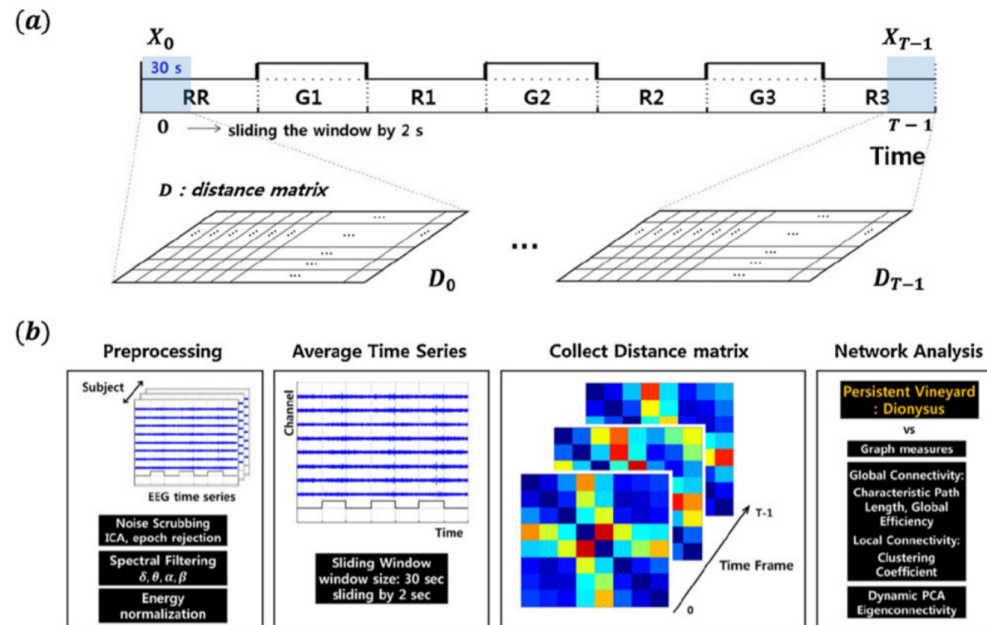
Dynamic functional connectivity in  
resting and gaming stages

EEG data of 54 students

Using  
Dionysus  
tool

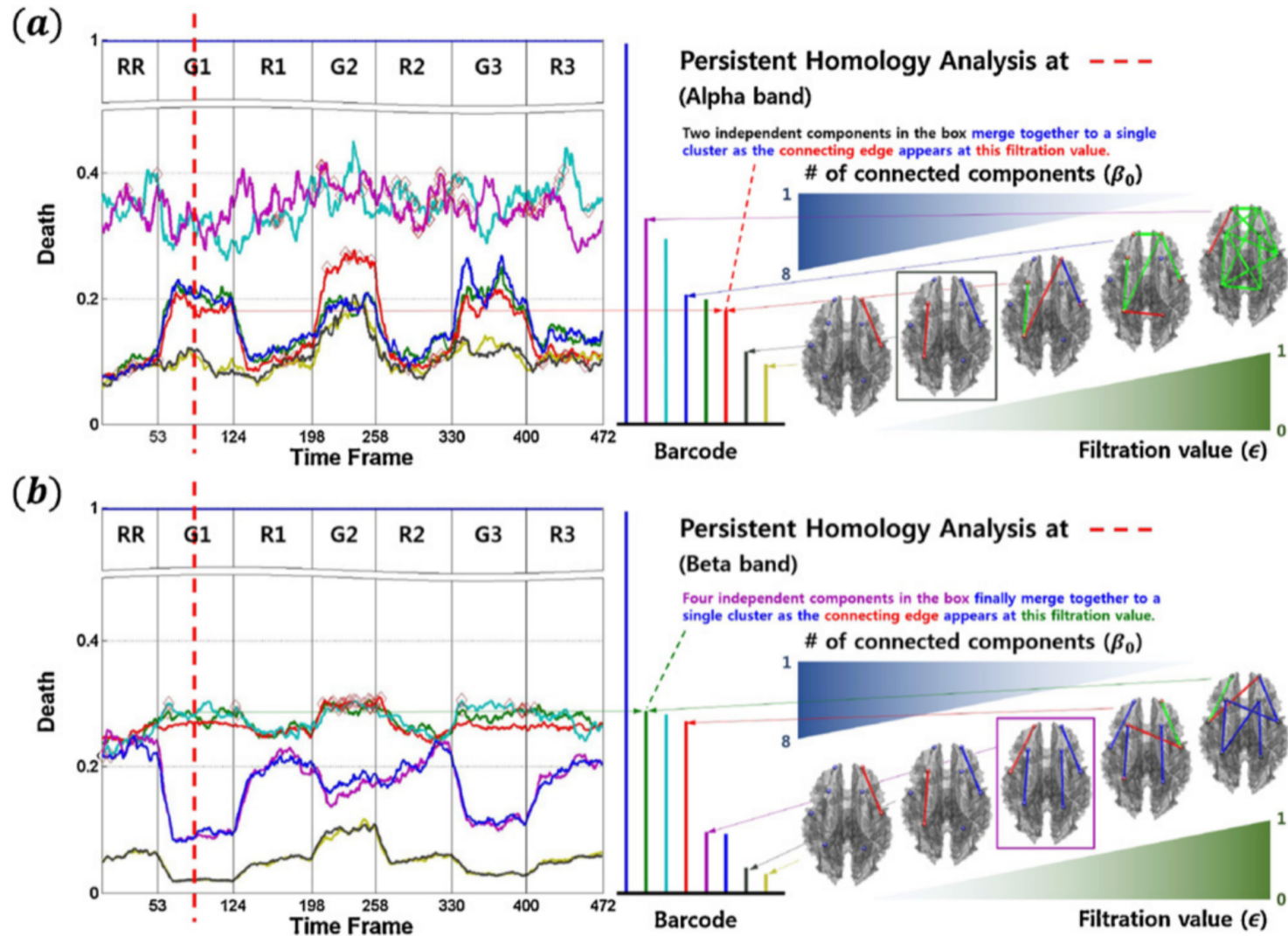
J. Yoo et al. / Journal of Neuroscience Methods 267 (2016) 1–13

5



**Fig. 3.** The schematic illustration of the experiment and dynamic FC estimation using a sliding window analysis. (a) A block paradigm experiment is designed with the resting and gaming stages. The illustrative example of the sliding window analysis is shown with 30 s window length and 2 s step size. For the dynamic FC estimation, we calculated a distance matrix  $D_l$  for each  $l \in \{0, \dots, T-1\}$  window, where  $T=472$  in this case. (b) The entire flow chart of the experiment from the data preprocessing to the brain network analysis are shown.

Result: Worked better than PCA & eigen connectivity



Crocker plots: combining scale & time

Consider  $k^{\text{th}}$  Betti number  $\beta_k(\epsilon, t)$   
as a function of both time &  
 $\epsilon$  in filtration

bifurcation

↳ build contour diagram

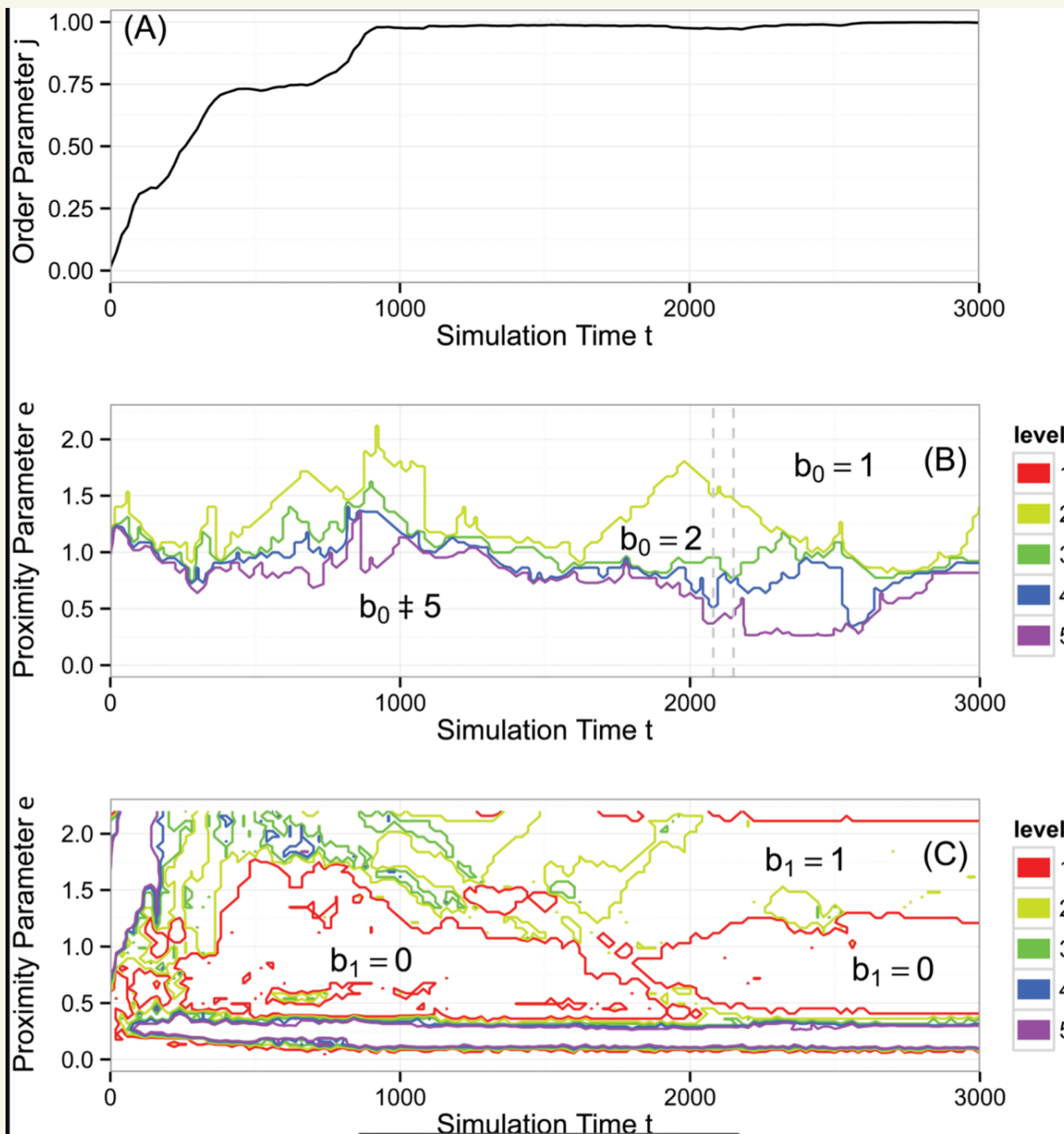
"Contour Realization of Computed  
 $k$ -dim hole Evolution in Rips complex"

Topaz, Ziegelmeier, Helverson 2015



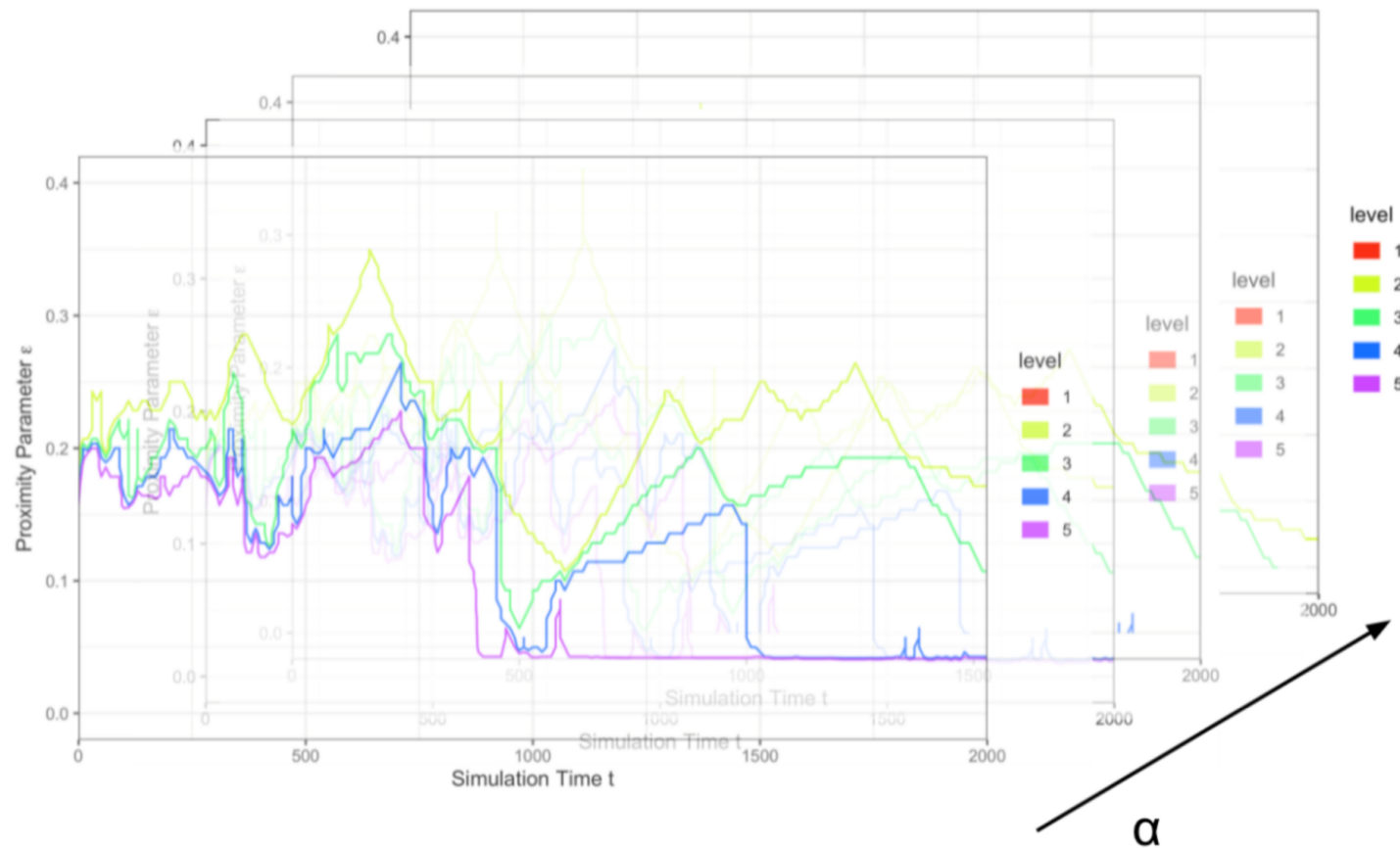


Breaking  
this  
down...



# Cracker stacks

Xian, Adams, Topaz,  
& Ziegelmeier 2020



$\alpha$ : Smoothing parameter

↳ can vectorize for ML models