

TDA - fall 2025

Persistence  
implementations



Last time: 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



# Complexity

With  $m$  simplices, matrix has  
size  $m \times m$

```
R = B
for j = 1 ... m do
    while ∃ j' < j with low(j') = low(j) do
        add column j' to column j
    end while
end for
```

repeats  $m$   
times

→ while loop:

each such operation must move  
 $low(j)$  up, but other columns can  
become 1 during operation

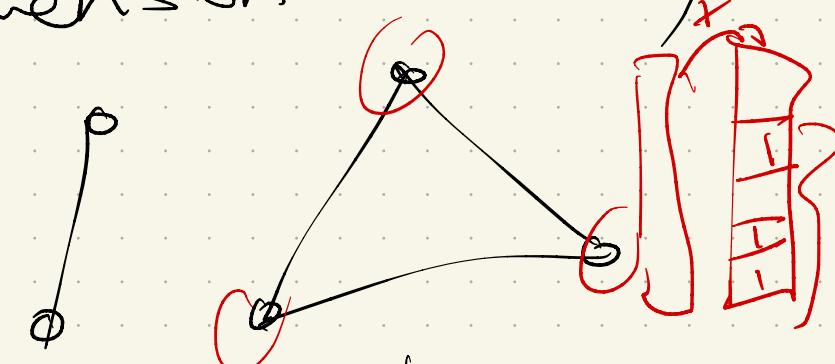
Worst case:  $O(m)$  additions to cancel  
a row  
each "add" takes  $O(m)$   $\Rightarrow O(m^3)$

# Improving this runtime

- ① Note that the matrix is sparse:  
a simplex of dimension  $d$  has  $\binom{d+1}{2}$  cofaces



So compressed representation helps in practice



- ② The algorithm can also be reduced to Gaussian elimination

$\hookrightarrow O(n^{\omega})$  time,  $\omega = [2, 2.373]$

## More speedups

Matrix algorithm last time:

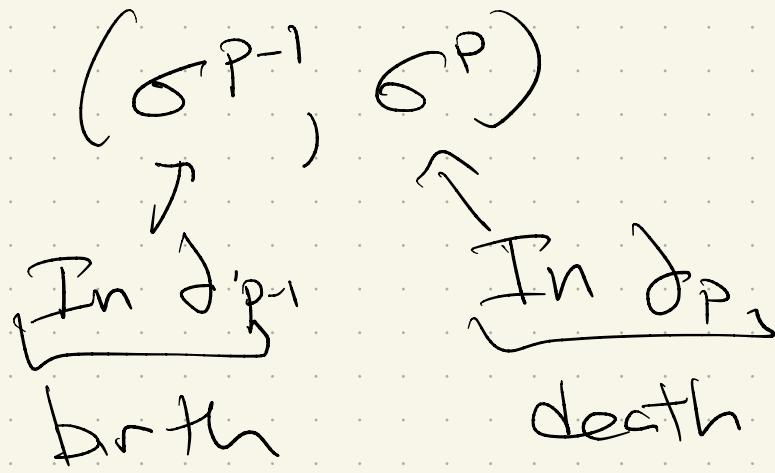
- Sweep columns left to right
- every addition to col  $j$  moves  $\text{low}[j]$  higher
- If additive, will 0 it out
  - ↳ might take many column ops
- But, once we zero it out,  
it's never used again!

# Practical improvement

Bauer et al 2014

Process filtration in backwards order  
(highest dim first)

Then for pair  $(\delta^{P-1}, \delta^P)$



Result: Can skip earlier column  
(since we know it will be 0's)

# Another method: Collapses

Boissonnat et al 2018

A simplicial cone for a complex  $L$  and a vertex  $a \not\in L$  is

$$ab = \{ \tau / \tau \in L \text{ or } \tau = \sigma \cup a, \sigma \in L \}$$

A vertex is dominated if  $\text{Ink}(v)$

is a simplicial cone:

$\exists v' \neq v$  and  $L \subseteq K$  s.t.  $\text{Ink}_K(v) = v'L$

Collapse:

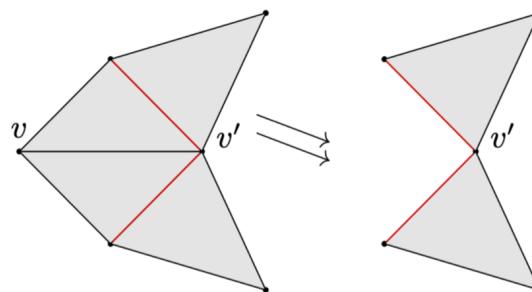


Figure 1 Illustration of an *elementary strong collapse*. In the complex on the left,  $v$  is dominated by  $v'$ . The link of  $v$  is highlighted in red. Removing  $v$  leads to the complex on the right.

If we collapse all possible vertices, get core  $K^c$ , which is unique up to isomorphism & has same homotopy type.

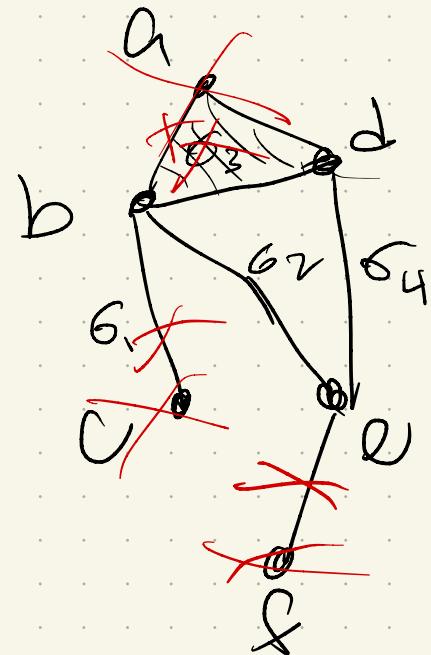
→ via a retract

Can compute via matrix:  
maximal simplices

	$\sigma_1$	$\sigma_2$	$\sigma_3$	$\sigma_4$	$\sigma_5$
a	0	0	1	0	0
b	1	1	1	0	0
c	1	0	0	0	0
d	0	0	1	1	0
e	0	1	0	1	1
f	0	0	0	0	1

	b	d	e
$\sigma_1$	1	0	0
$\sigma_2$	1	0	1
$\sigma_3$	1	1	0
$\sigma_4$	0	1	1
$\sigma_5$	0	0	1

	$\sigma_2$	$\sigma_3$	$\sigma_4$
b	1	1	0
d	0	1	1
e	1	0	1
$\sigma_5$	0	0	1



**Aside:**

Lots of work on speeding up  
persistence

↳ and on finding lower bounds:  
cases where you really need  
 $O(n^w)$  time.

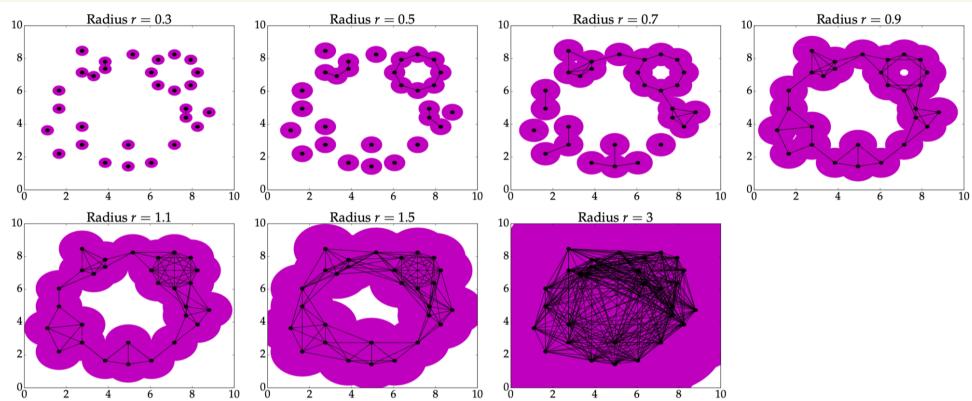
Not mentioned: parallelization

The workflow so far

Build a filtration  $F$  from a simplicial complex  
↳ usually parameterized by a function  
 $f$ , via sublevel sets

Example:  $P \subseteq \mathbb{R}^n$

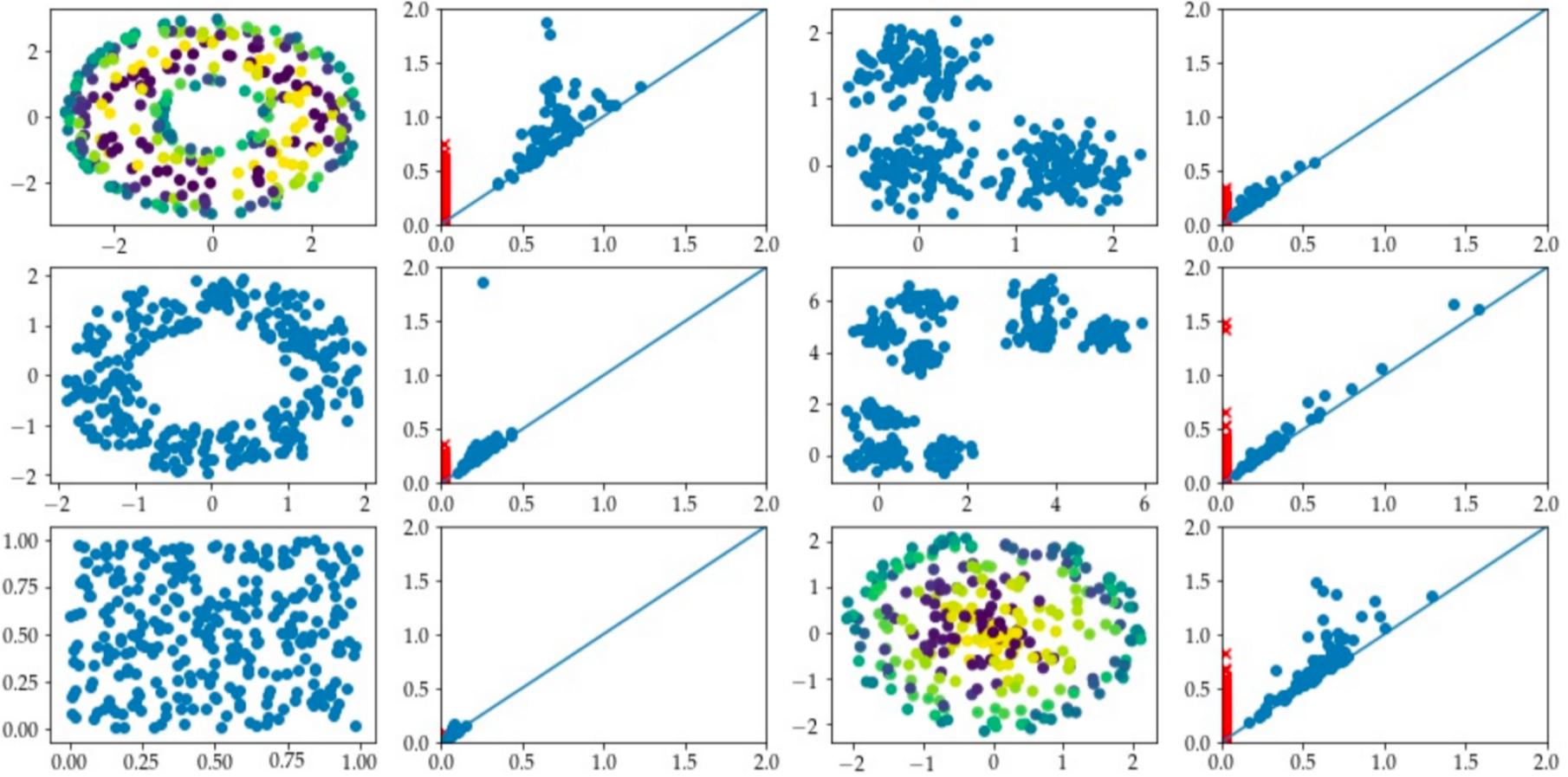
Build Rips filtration:  
for  $0 \leq r_1 \leq \dots \leq r_k$ ,  $K_i = VR(R, r_i)$



→ Persistence diagram

Result!

$H_0$  and  $H_1$



... now what?

# Distance measures

A **distance** on a set  $X$  is a function

$$d: X \times X \rightarrow \mathbb{R}_{\geq 0} \text{ s.t. } \forall x, y, z \in X$$

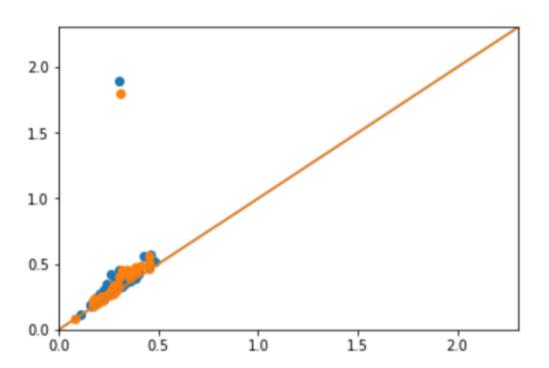
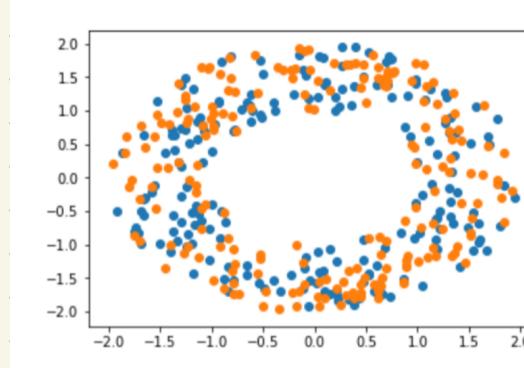
- $d(x, y) \geq 0$  +  $d(x, y) = 0 \Leftrightarrow x = y$

- $d(x, y) = d(y, x)$

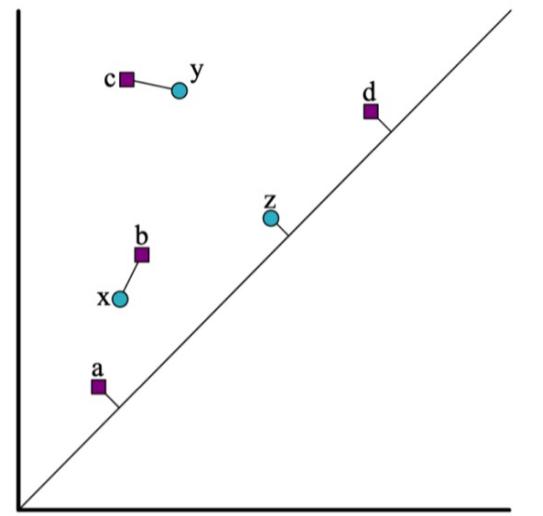
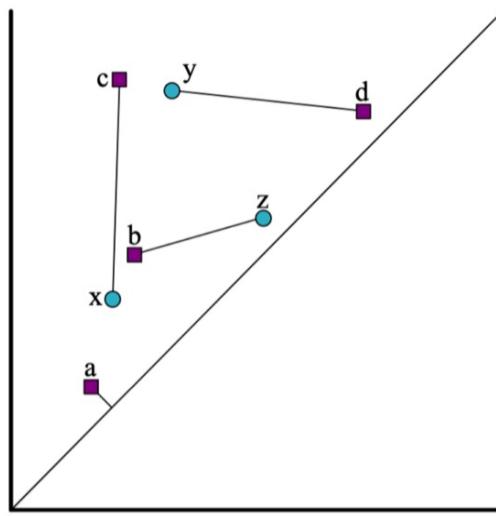
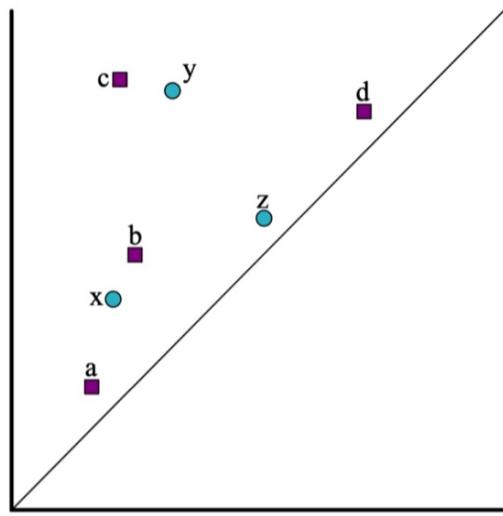
- $d(x, z) \leq d(x, y) + d(y, z)$

Our goal: distances for PDs

$$X = \left\{ D_{gm} F(K) \right\}_{F, K}$$



How to quantify "nearby" here?

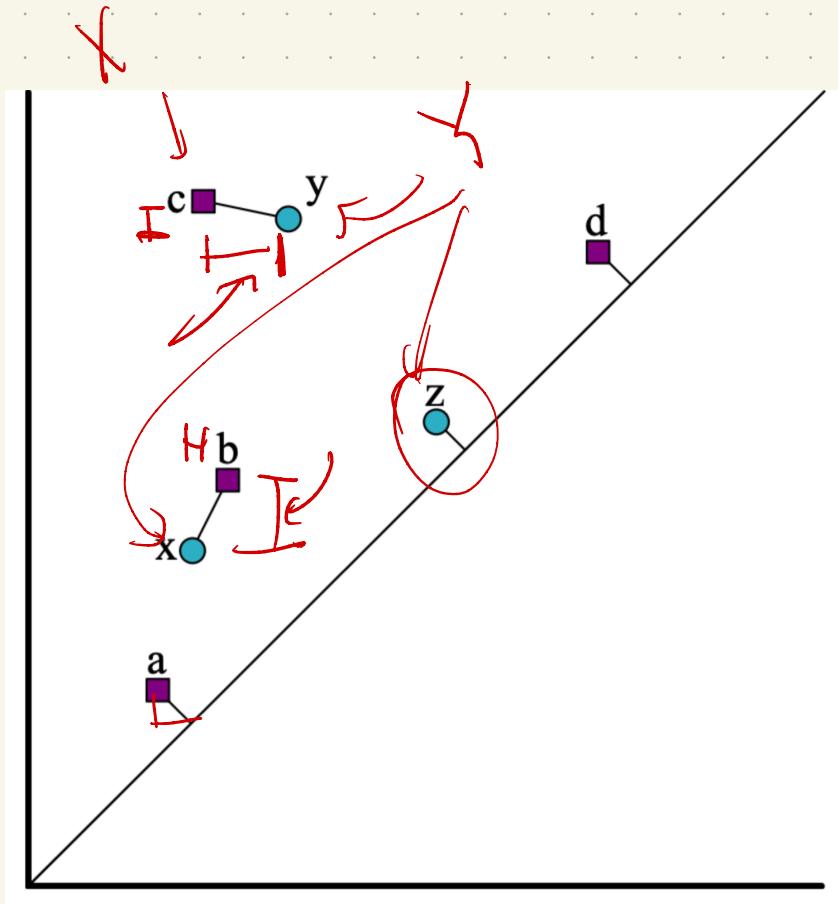


Major goal: Stability

# Bottleneck distance (Take 1)

Given 2 diagrams  $X, Y \subset \mathbb{R}^2$ ,

$$d_B(X, Y) = \inf_{\ell: X \rightarrow Y} \sup_{x \in X} \|x - \ell(x)\|_\infty$$



Here!

$$\ell(a) = \text{diagonal}$$

$$\ell(b) = x$$

$$\ell(c) = y$$

$$\ell(d) = \text{diagonal}$$

## Alternate definition

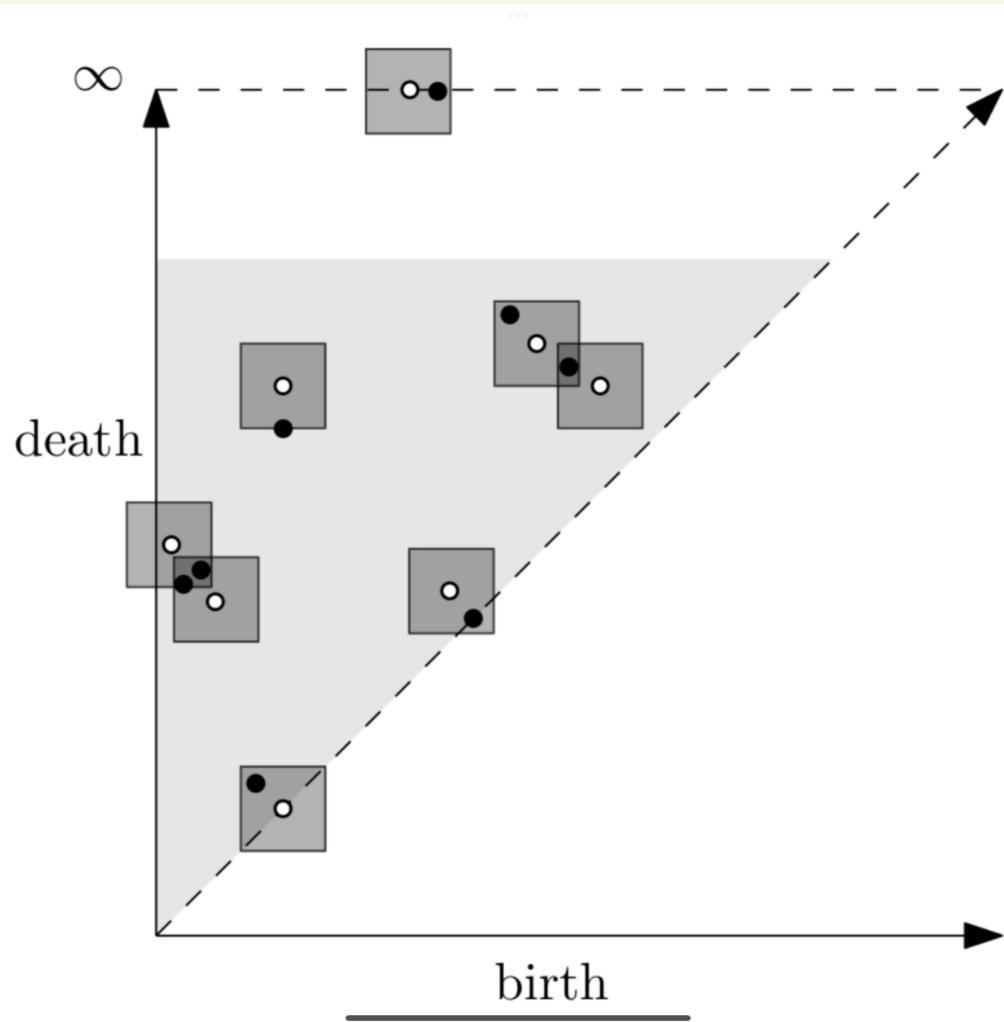
A matching between  $X + Y$  is a bijection on a subset of the off-diagonal points of the 2 diagrams,  $X' \subseteq X + Y' \subseteq Y$ .

Cost of matching:

$$c(M) = \sup \left\{ \|x - M(x)\|_\infty \mid x \in X' \right\} \\ \cup \left\{ \frac{1}{2} |x_1 - x_2| \text{ s.t. } (x_1, x_2) \in X \setminus X' \cup Y \setminus Y' \right\}$$

Bottleneck  $d_B(X, Y) = \inf_M c(M)$

# Another view: Los balls in $\mathbb{R}^2$

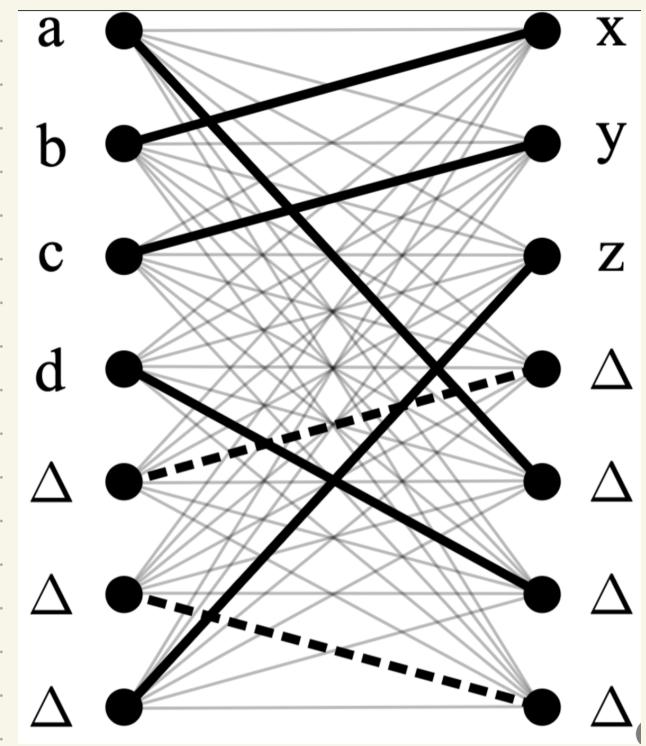
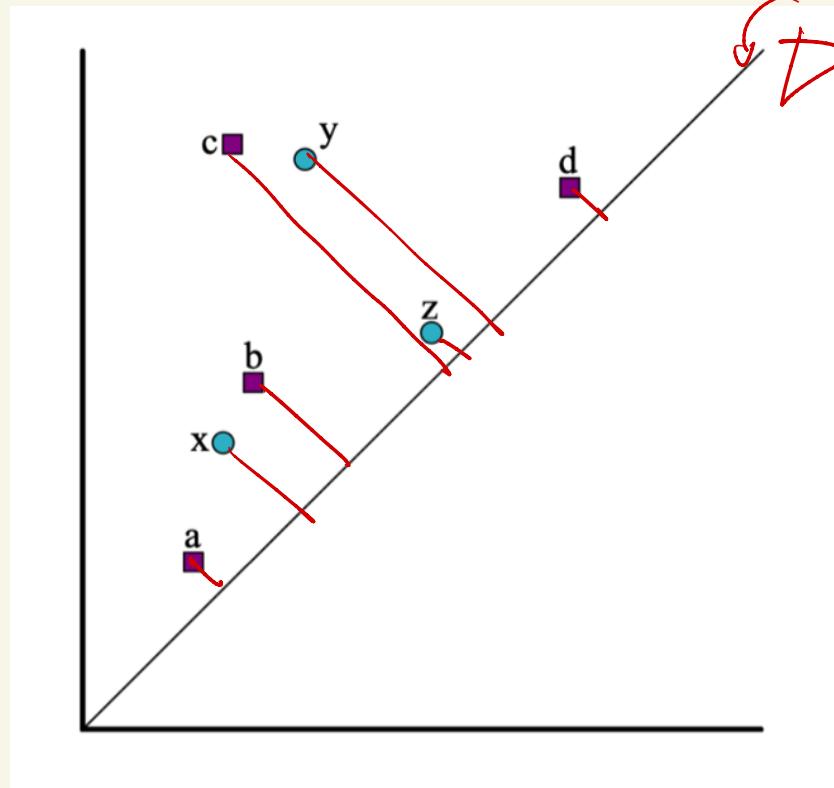


Min  $\epsilon$  st.  
 $\epsilon$  balls around  
every point  
either:

- includes at least 1 point from other set
- touches the diagonal)

How to compute?

Reduce to a graph problem



Min cost matchings: use network flow  
on graph  $\rightsquigarrow O((\# \text{per points})^2)$