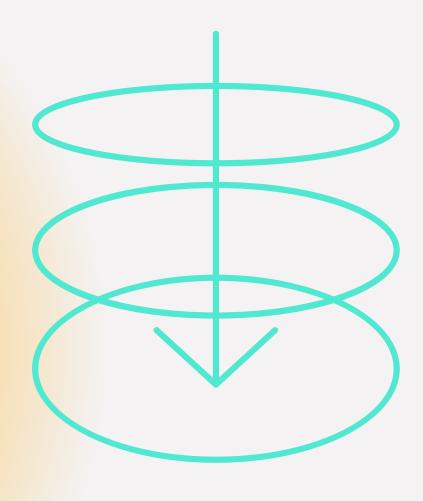
Introduction to



non-linear dimensionality reduction



Erubiel Tun Moo Fernando Rodríguez Zapata Braulio Millan Chi Michelle Cámara González

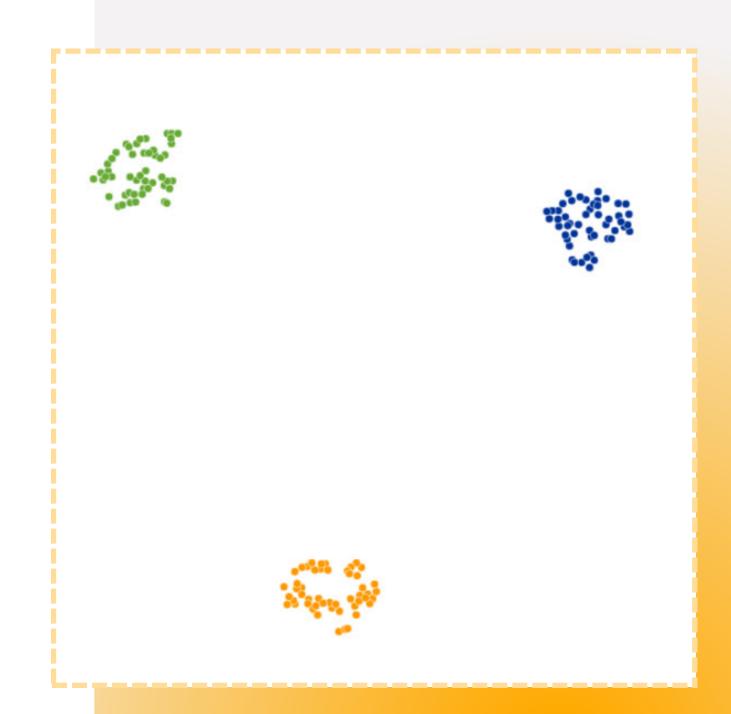


9°A

Team 5

#### 01 - Definition

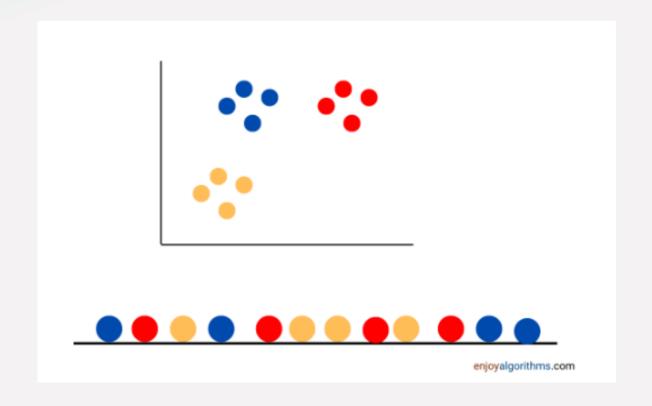
- Unsupervised dimensionality reduction technique.
- For data exploration and visualizing highdimensional data.
- It separate data that cannot be separate by a line.
- Easiest to use when features are numeric.



#### 02 - How it works

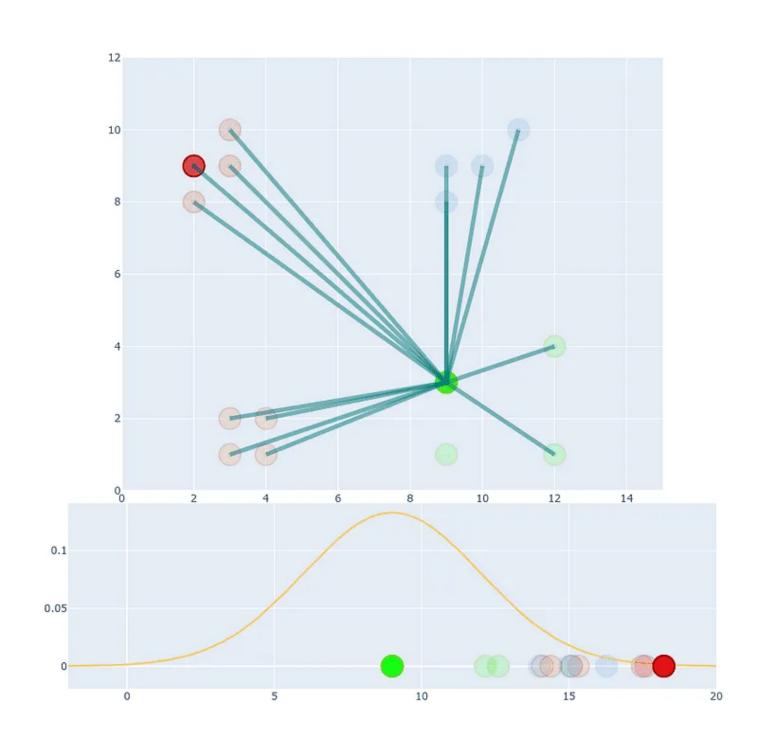
- 1. Similarity Measure
- 2. Mapping to Lower Dimension
- 3. Divergence Minimization
- 4. Cluster Formation





### 03 - Steps

- 1. Calculate joint probabilities (Gaussian).
- 2. Low dimension space.
- 3. Calculate joint probabilities (t-distribution).
- 4. Calculate divergence.
- 5. Optimize.

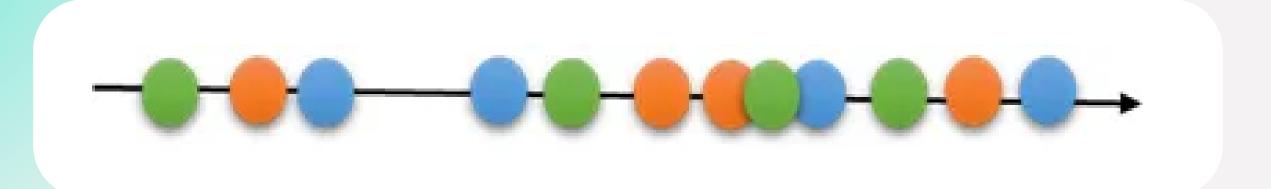


$$p_{j|i} = \frac{\exp(-||x_i - x_j||^2/2\sigma_i^2)}{\sum_{k \neq i} \exp(-||x_i - x_k||^2/2\sigma_i^2)},$$

$$p_{ij} = \frac{p_{j|i} + p_{i|j}}{2n}$$

## Gaussian distribution

## t distribution

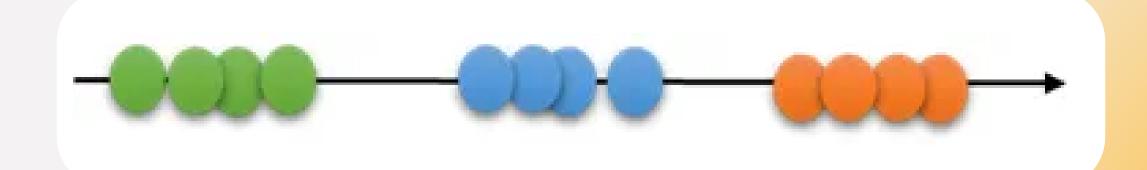


$$q_{ij} = \frac{\left(1 + \|y_i - y_j\|^2\right)^{-1}}{\sum_{k \neq l} \left(1 + \|y_k - y_l\|^2\right)^{-1}}$$

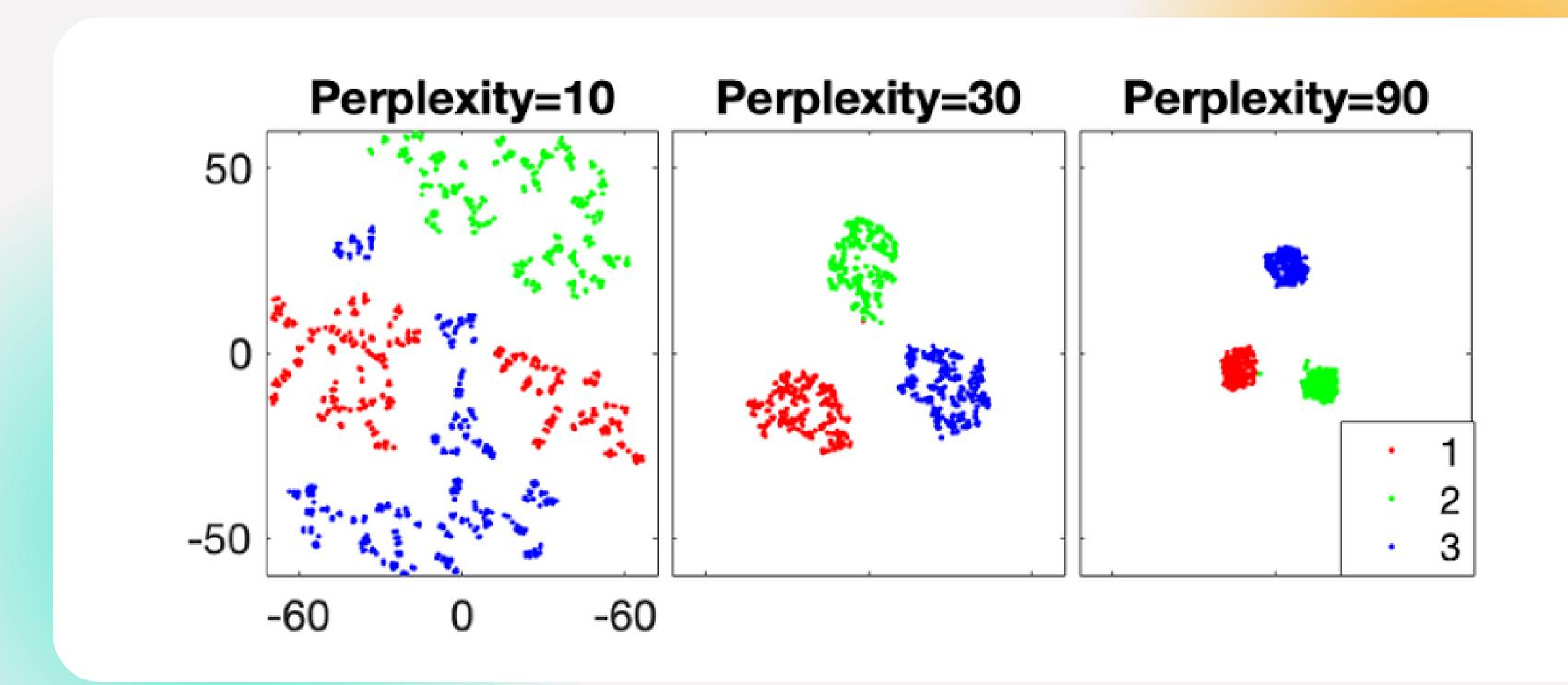
# Kullback-Leiber divergence

$$C = D_{\mathrm{KL}}(P \parallel Q) = \sum_{x \in \mathcal{X}} P(x) \log \left(rac{P(x)}{Q(x)}
ight)$$

$$C = KL(P||Q) = \sum_{i} \sum_{j} p_{ij} \log \frac{p_{ij}}{q_{ij}}$$

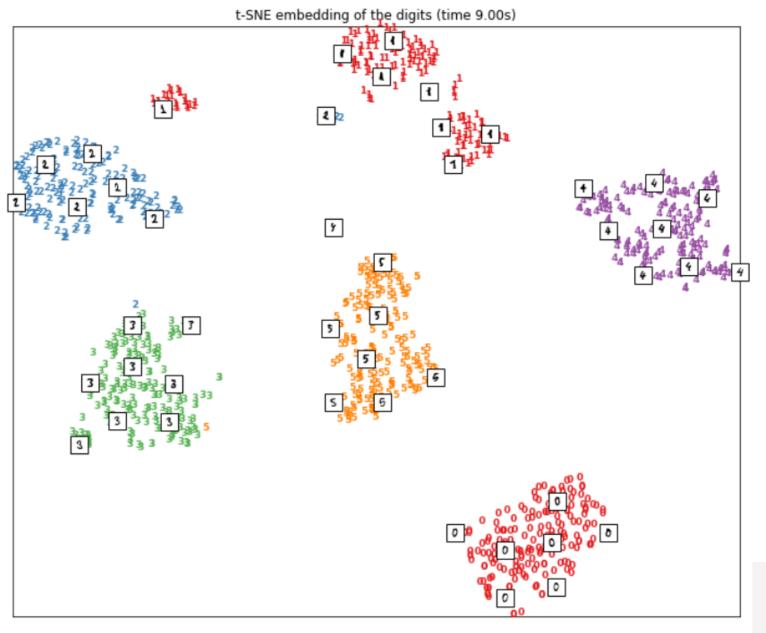


## 04 - t-SNE perplexity



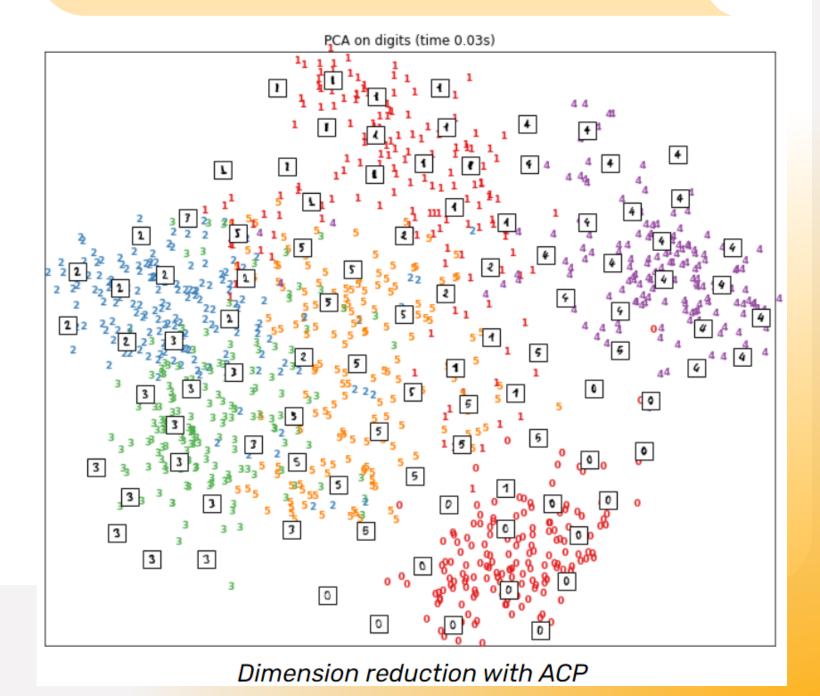
#### 05 - TSN-E vs PCA

- Nonlinear technique.
- Lower dimensional space.



Dimension reduction with the t-SNE method

Preserving large pairwise distances.Maximize variance.



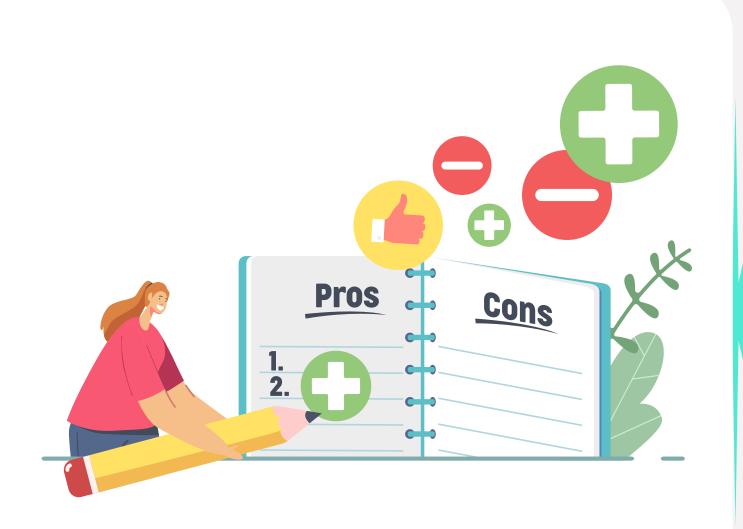
#### 06 - Advantages and Disadvantages

### Advantages

- 1. Handles Non-linear Data
- 2. Preserves Local Structure

## Disadvantages

- 1. Computational Complexity
- 2. Non-Deterministic



#### **07-References**

- Harshit. (n.d.). T-SNE algorithm in machine learning. Enjoyalgorithms.com. Retrieved 19
   September 2023, from https://www.enjoyalgorithms.com/blog/tsne-algorithm-in-ml
- (N.d.). Datacamp.com. Retrieved 19 September 2023, from https://www.datacamp.com/tutorial/introduction-t-sne
- (burnpiro), K. E. (2020, April 13). t-SNE clearly explained. Retrieved September 19, 2023, from Towards Data Science website: https://towardsdatascience.com/t-sne-clearly-explained
- Soroker, A. (2020, August 4). T-SNE explained math and intuition the Startup medium. Retrieved September 19, 2023, from The Startup website: https://medium.com/swlh/t-sne-explained-math-and-intuition

#### **THANKS!**