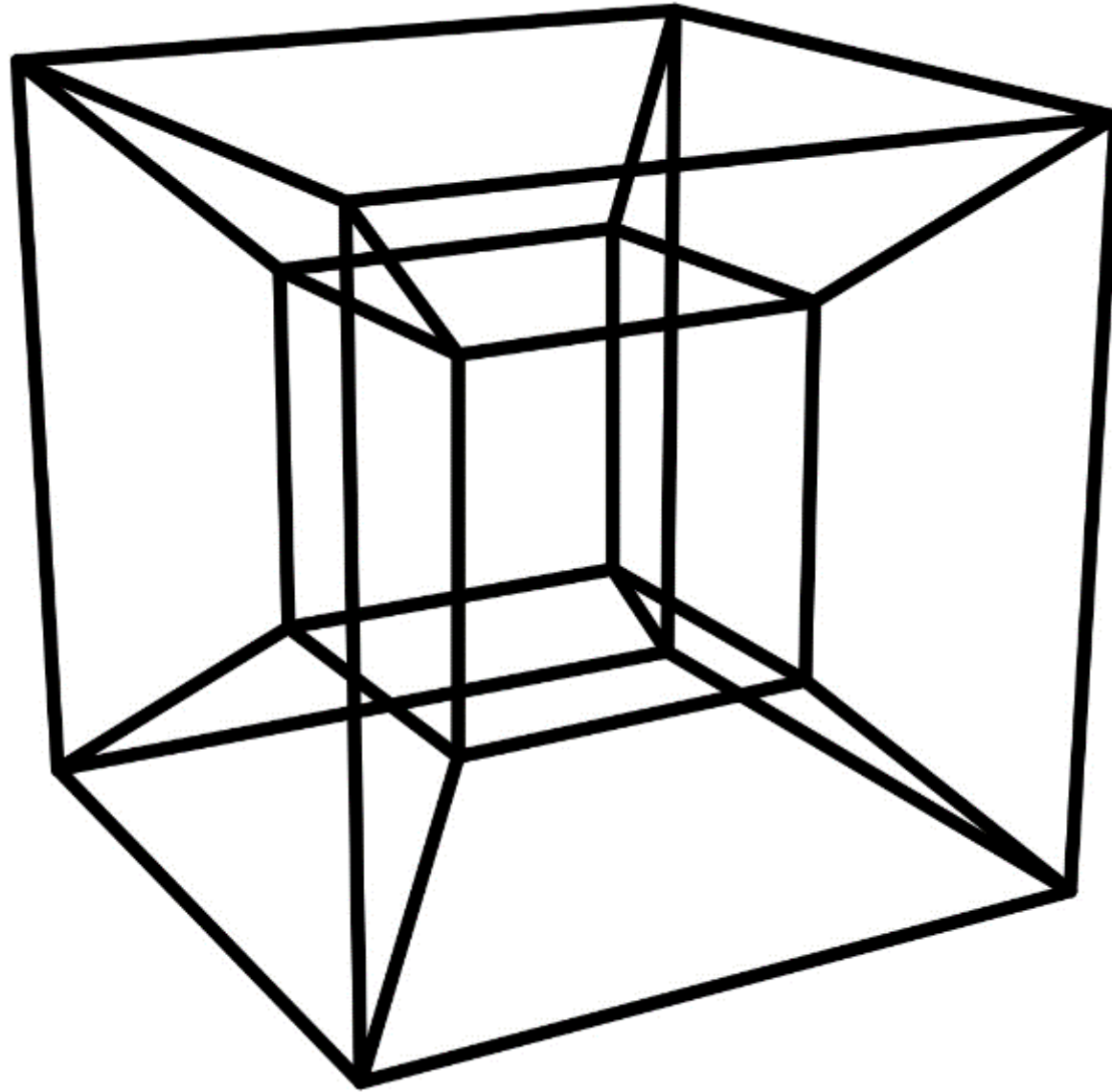


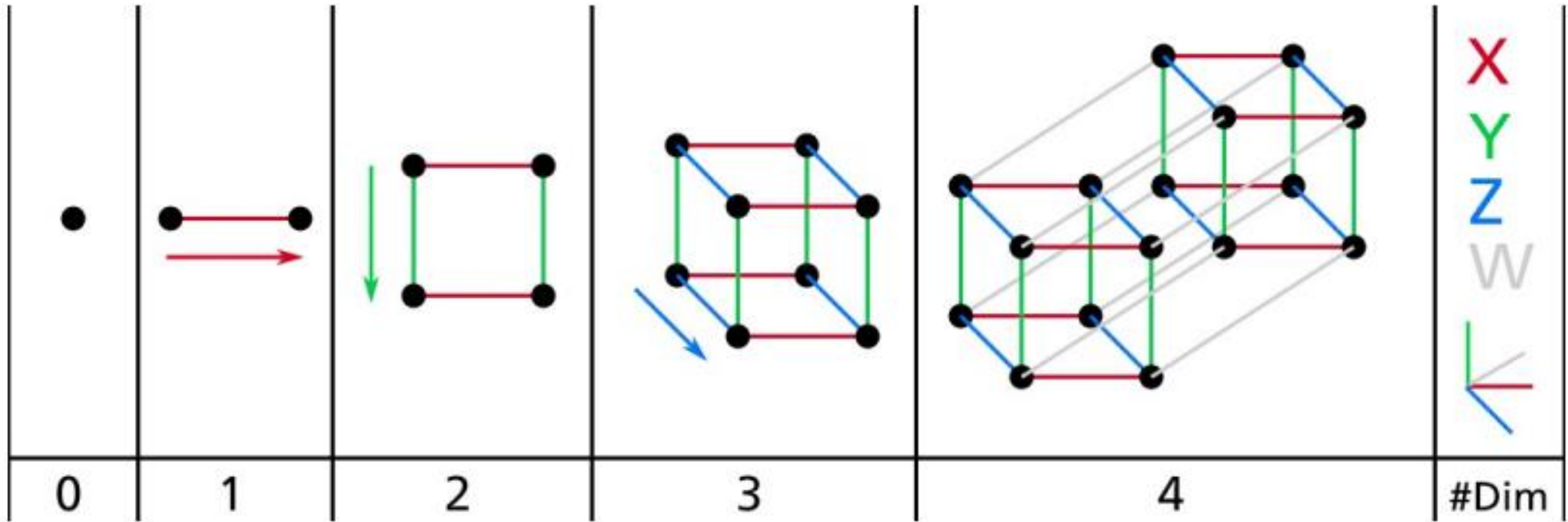
# Hands-On Machine Learning with Scikit-Learn & TensorFlow

Ana Maria Sandoval Jimenez, Jannis Busch & Sabrina Steinert



# Chapter 8. Dimensionality Reduction

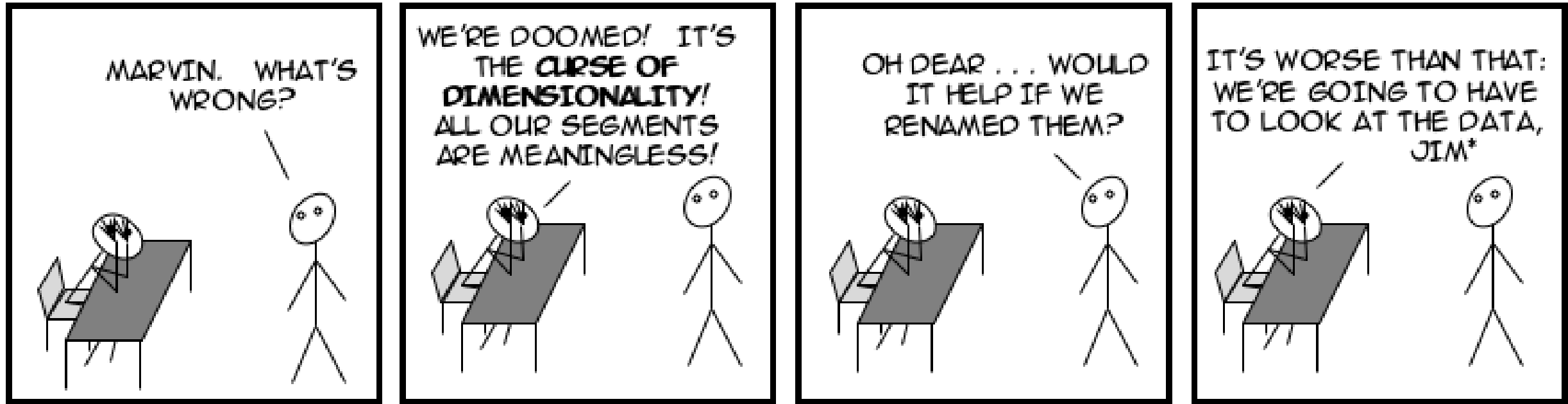






**Curse of**

**Dimensionality**



[HTTP://SCIENTIFICMARKETER.COM](http://scientificmarketer.com)

COPYRIGHT © NICHOLAS J RADCLIFFE 2007. ALL RIGHTS RESERVED.  
\* WITH APOLOGIES TO MR SPOCK & STAR TREK.

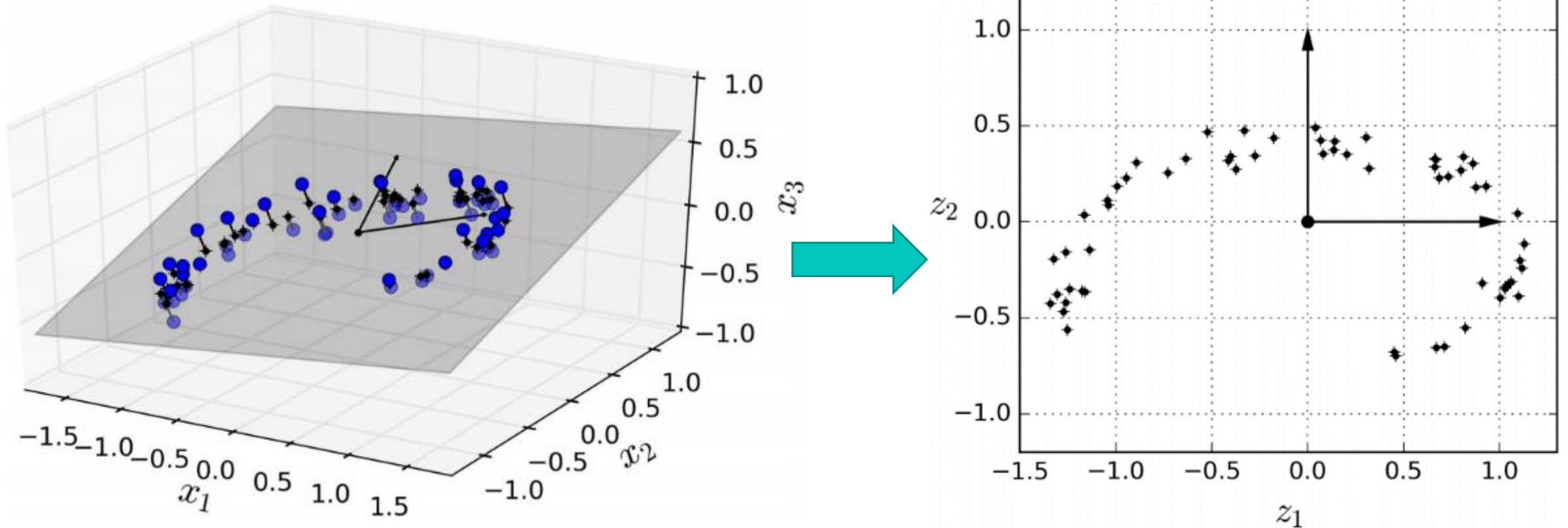
The problem caused by the exponential increase in volume associated with adding extra dimensions to a (mathematical) space.

# Dimensionality Reduction Approaches

## Projection & Manifold Learning

# PROJECTION

Reduce the dataset's dimensionality from 3D to 2D

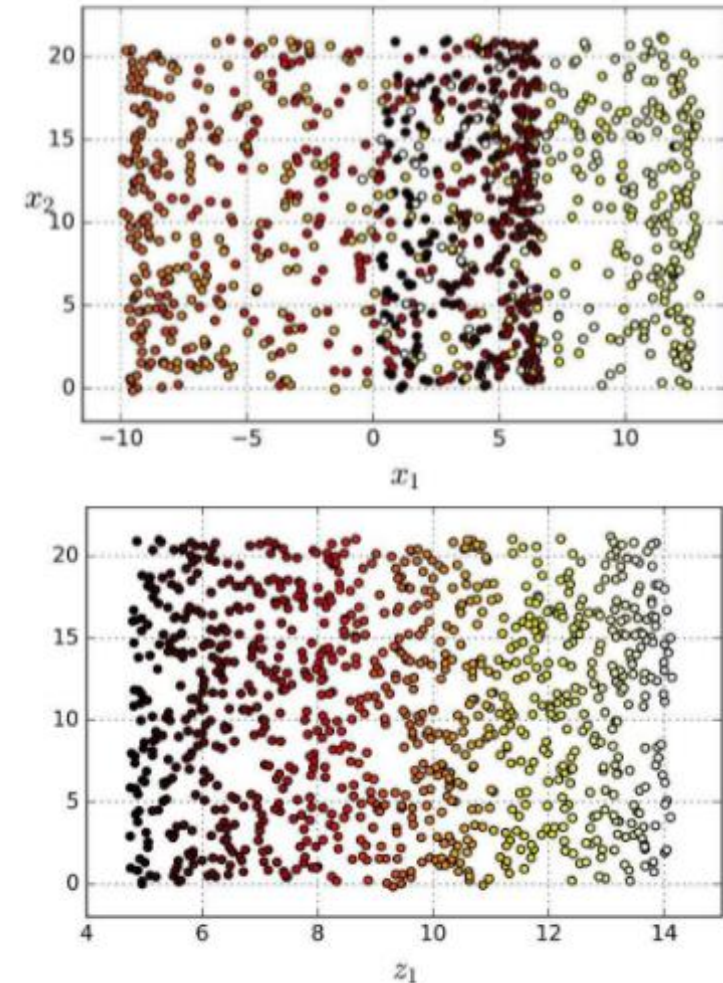
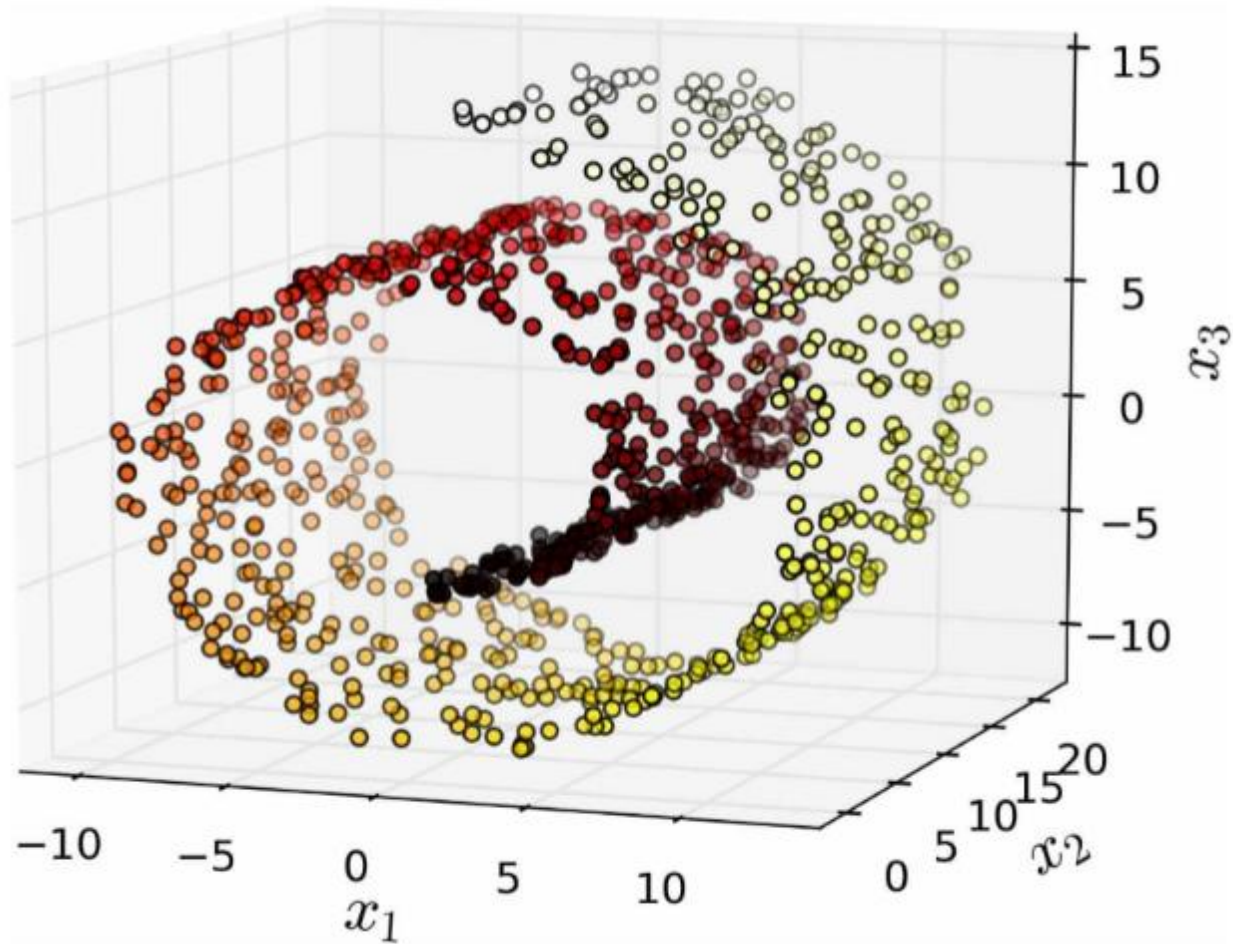




# MANIFOLD



# MANIFOLD LEARNING





# Dimensionality Reduction Technique

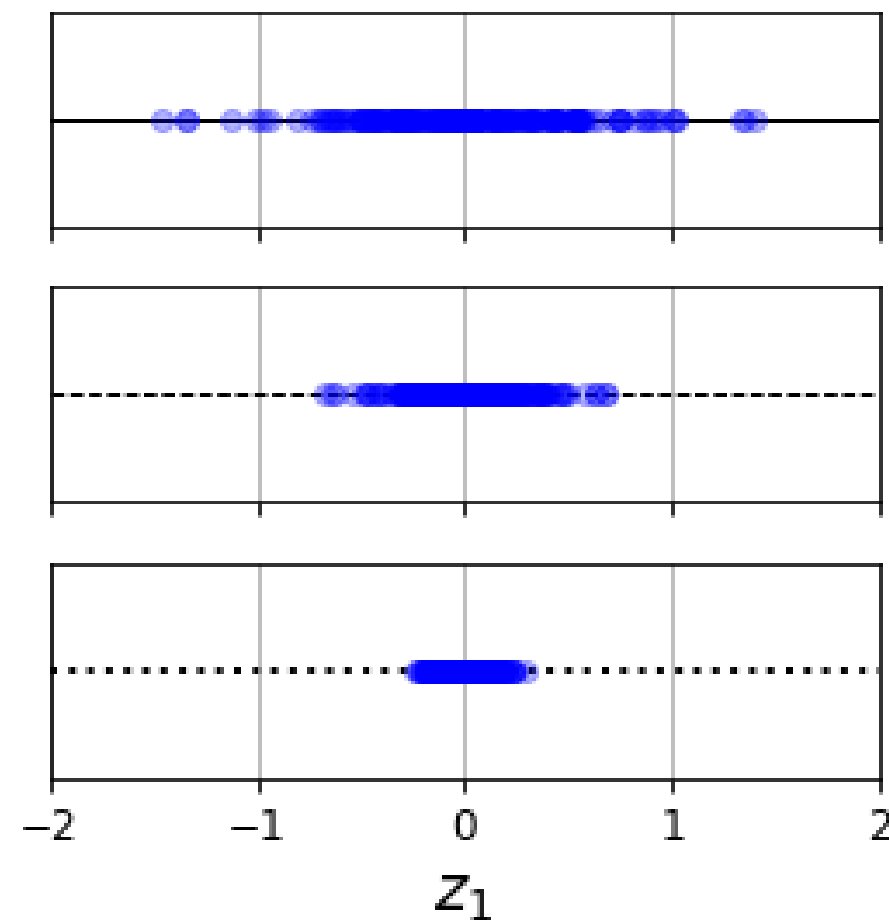
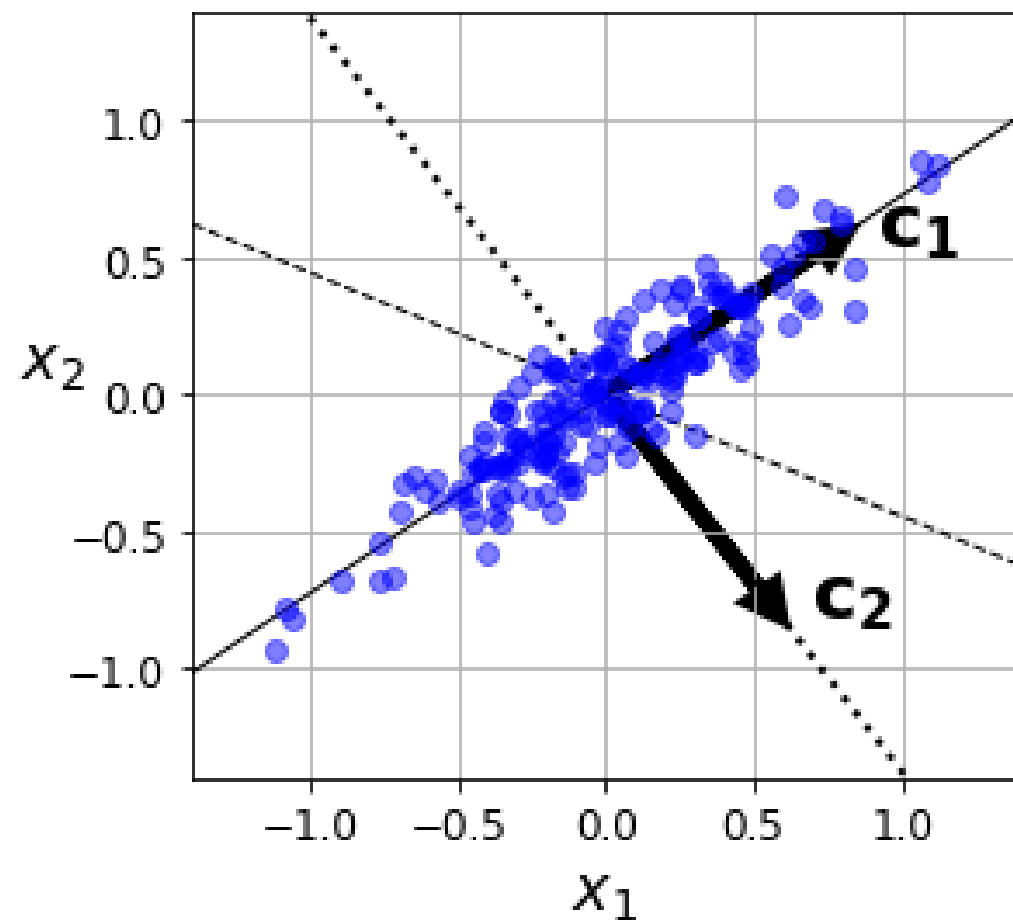
*Projection*

## Principal Component Analysis



# PCA

## PRESERVING THE VARIANCE





# PCA

# PRINCIPAL COMPONENTS

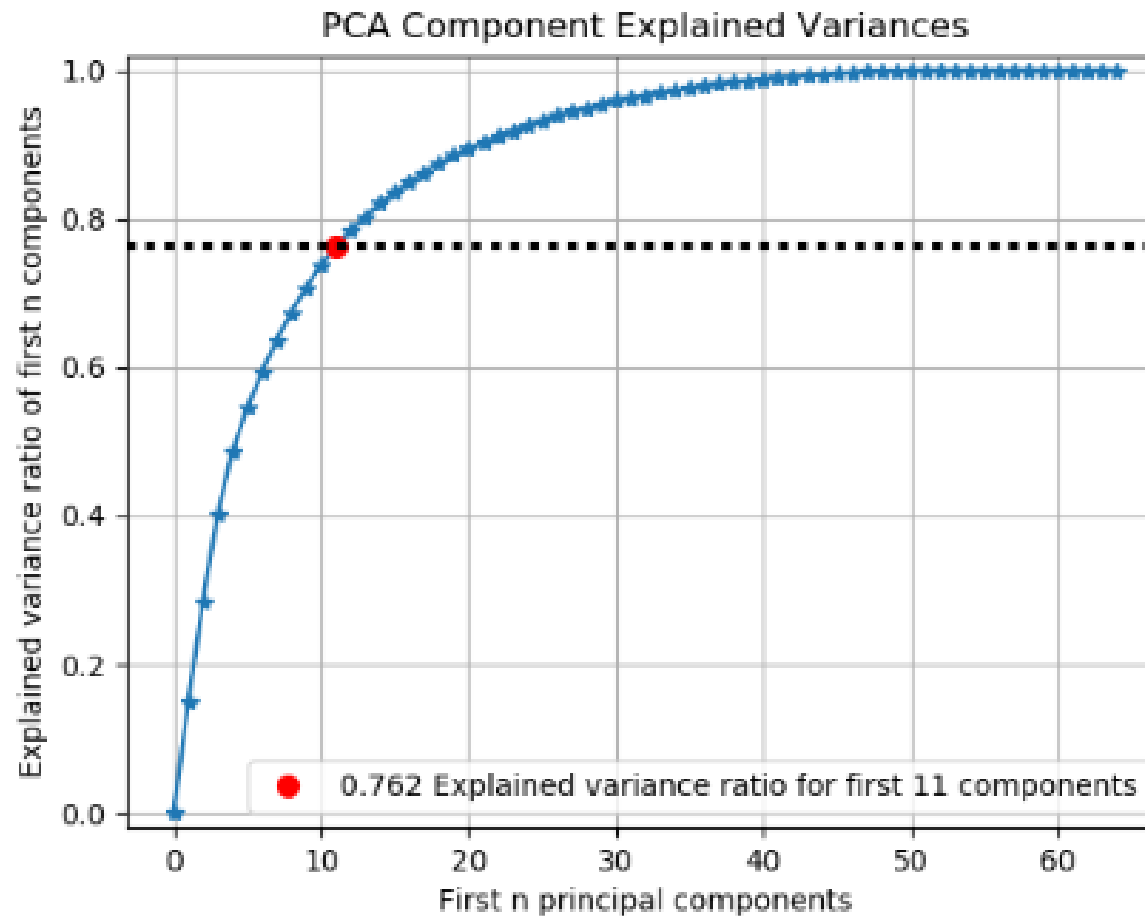


Standard matrix factorization technique:  
SINGULAR VALUE DECOMPOSITION (SVD)

CENTER THE DATA!!

# PCA

## EXPLAINED VARIANCE RATIO

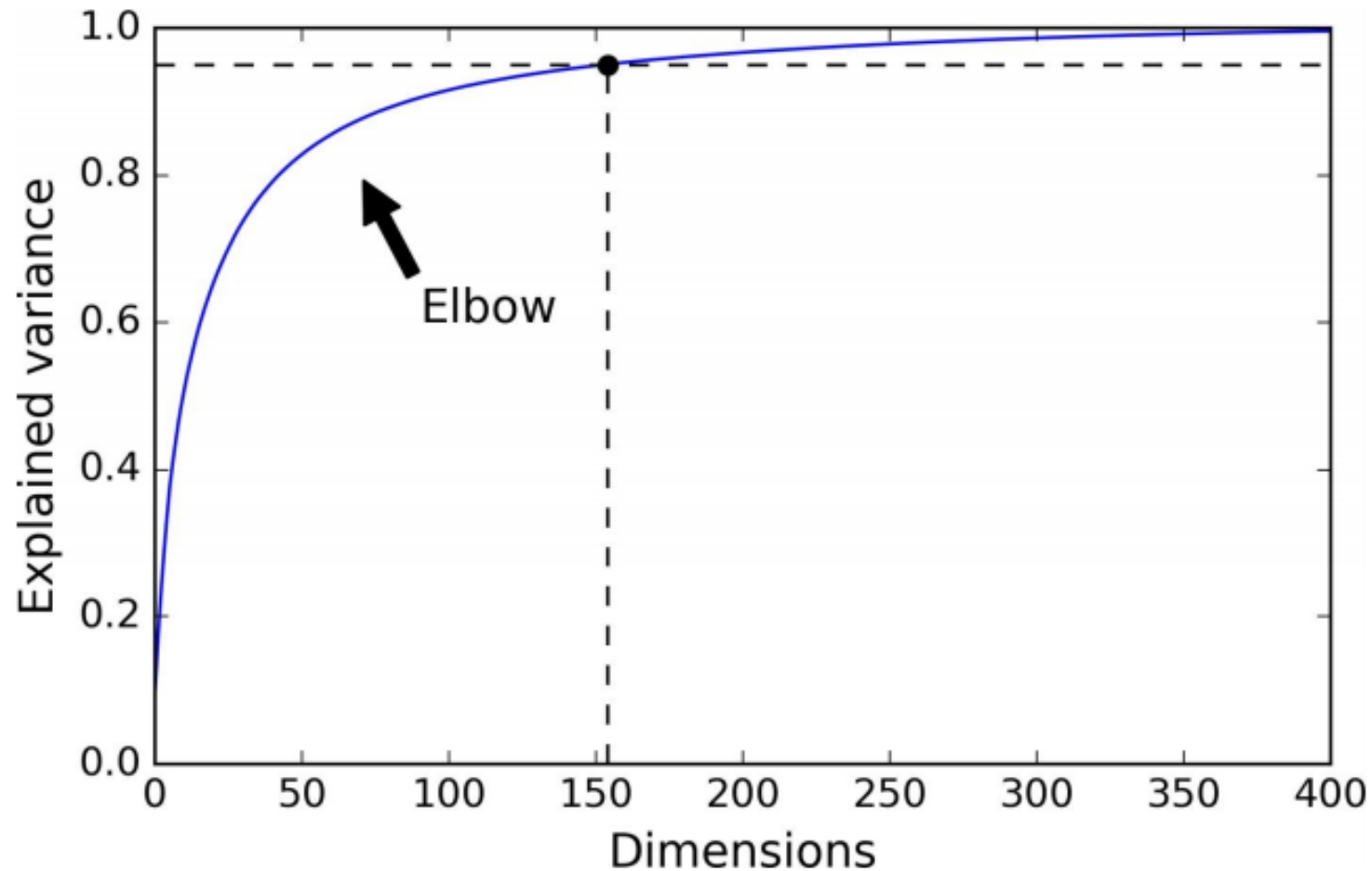


# THE RIGHT NUMBER OF COMPONENTS

Which ratio of variance do you wish to preserve?

# PCA

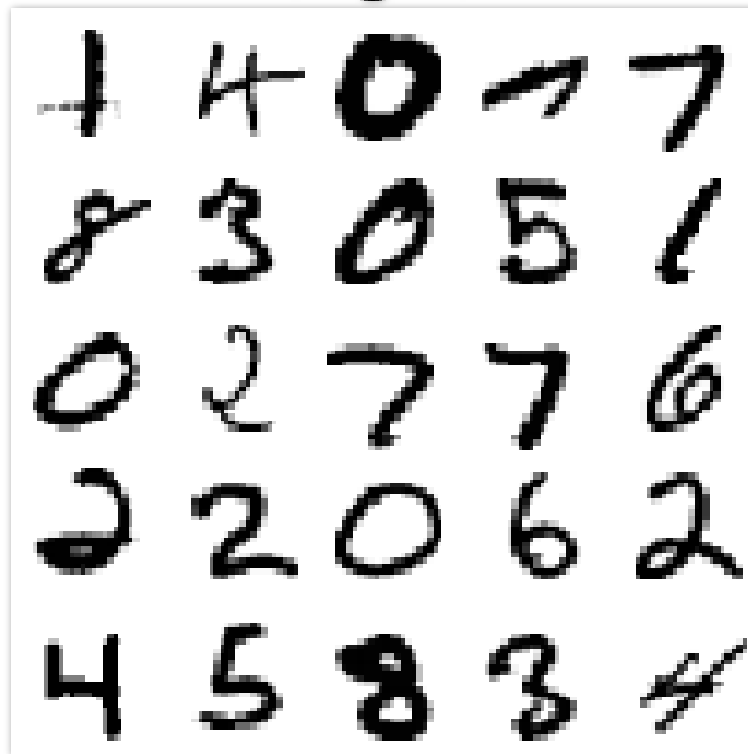
## THE RIGHT NUMBER OF COMPONENTS



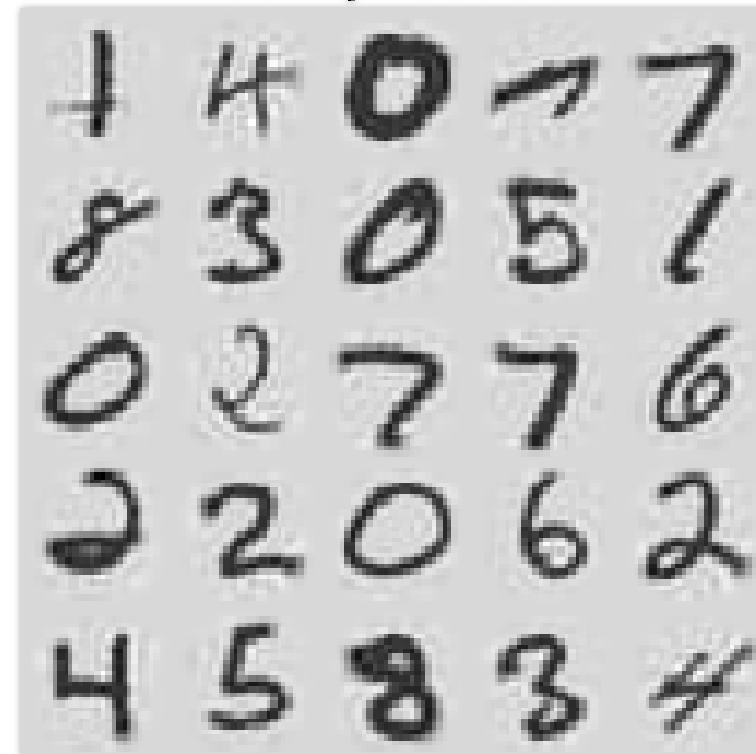


# PCA COMPRESSION

Original

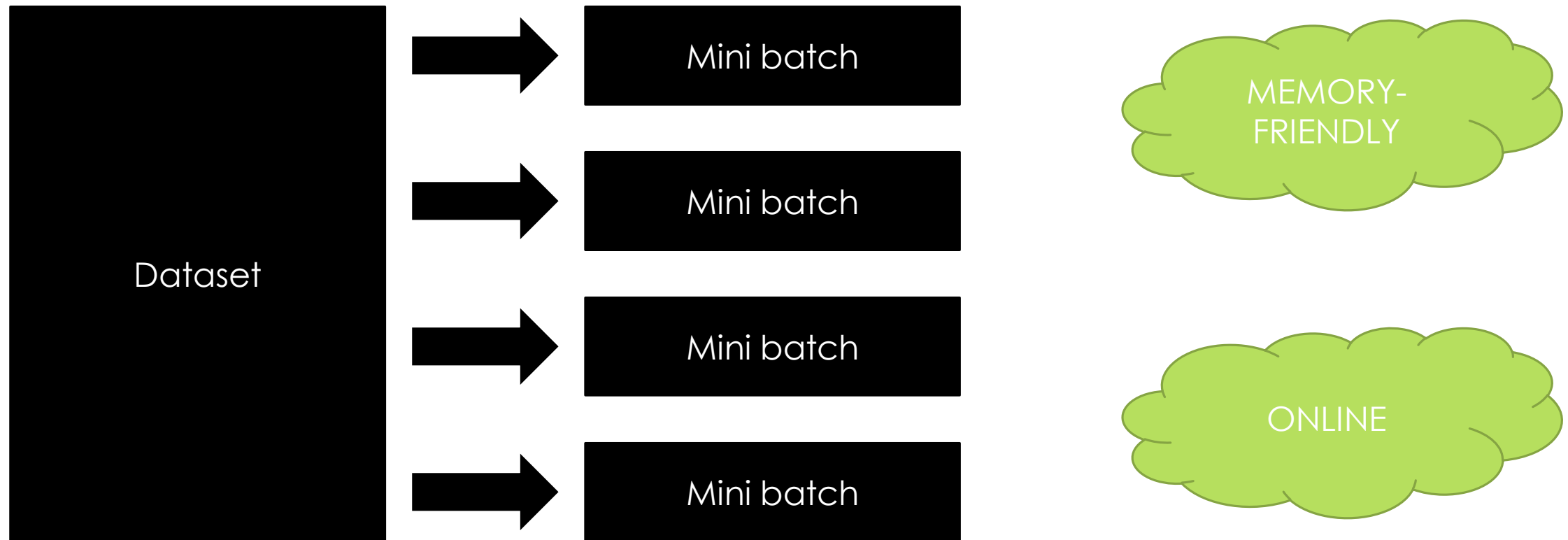


Compressed



# PCA

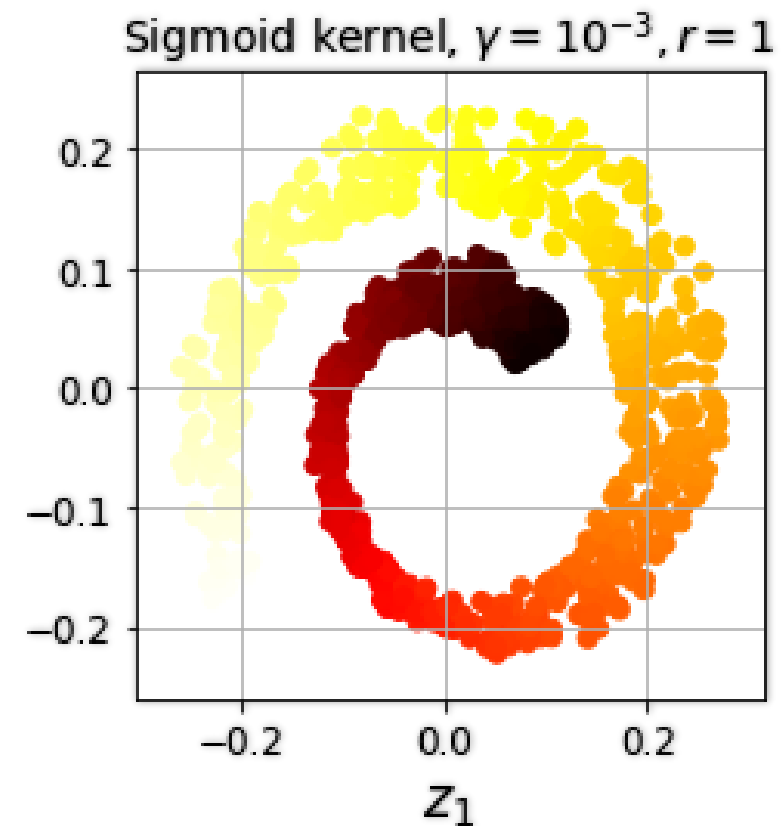
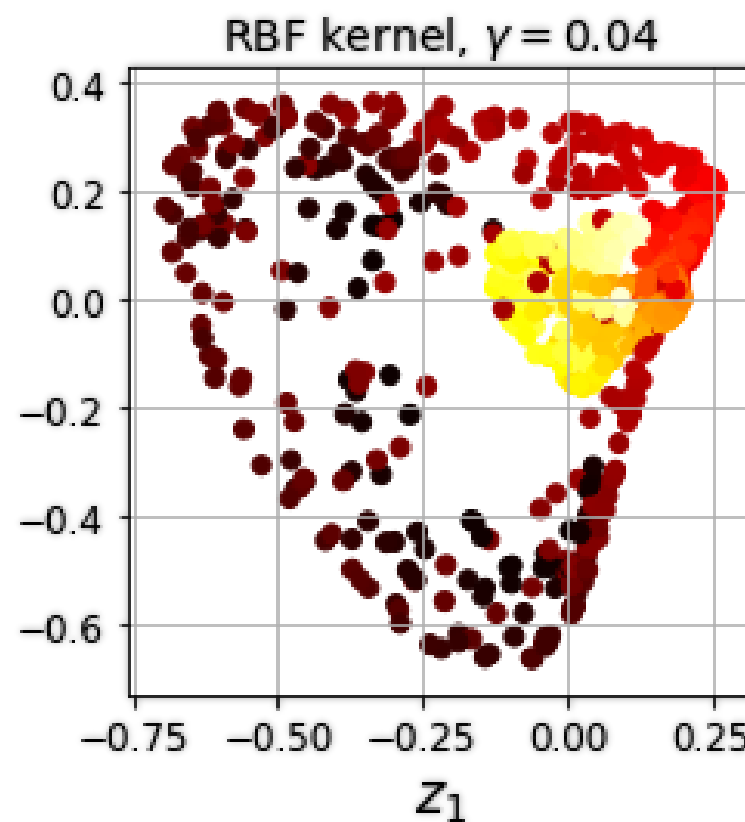
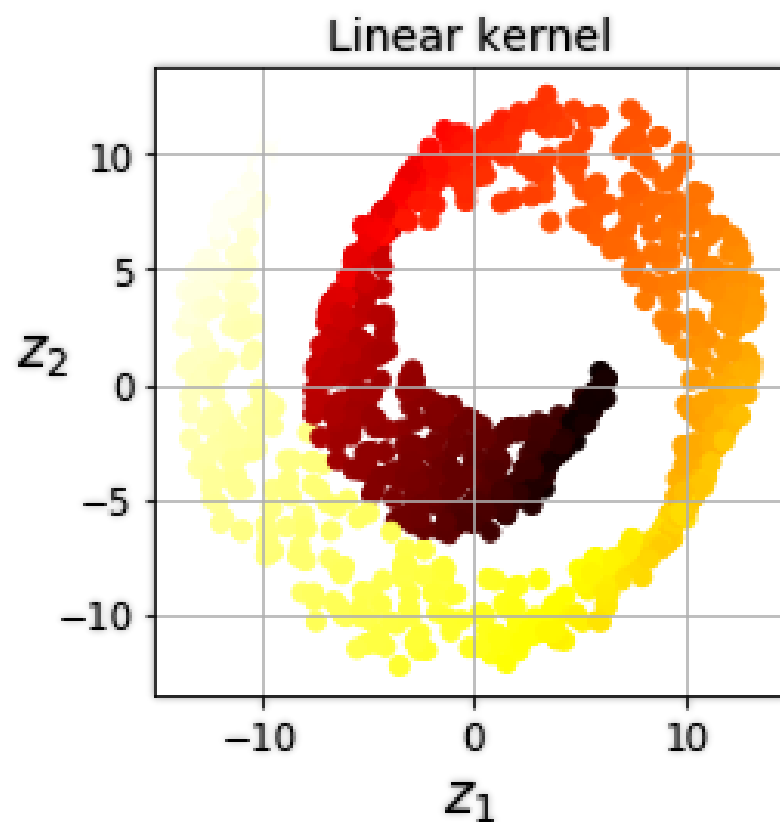
## INCREMENTAL PCA



# PCA

## KERNEL PCA

Kernel Trick





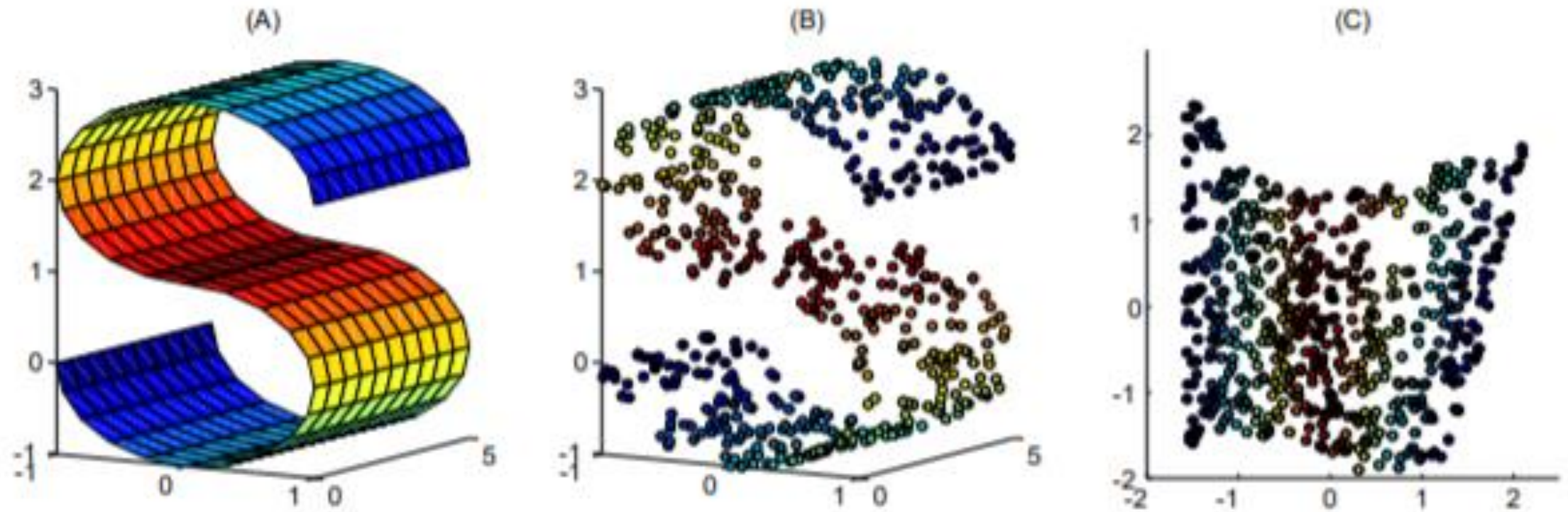
# Dimensionality Reduction Technique

*Manifold Learning*

## Locally Linear Embedding



# LLE



# Dimensionality Reduction Technique

## Other Techniques

- Multidimensional Scaling
- Isomap
- t-Distributed Stochastic Neighbor Embedding
- Linear Discriminant Analysis



# DIMENSIONALITY REDUCTION

## CHAPTER 8

Github Repository

- Ipython notebook **Chapter 8 Tutorial**
- Ipython notebook **Iris Data**
- PDF presentation **Chapter 8 Slides**

Ana Maria Sandoval Jimenez, Jannis Busch & Sabrina Steinert



# Kernel Trick (SVM)

