

1.3. Unsupervised Learning and Reinforcement Learning

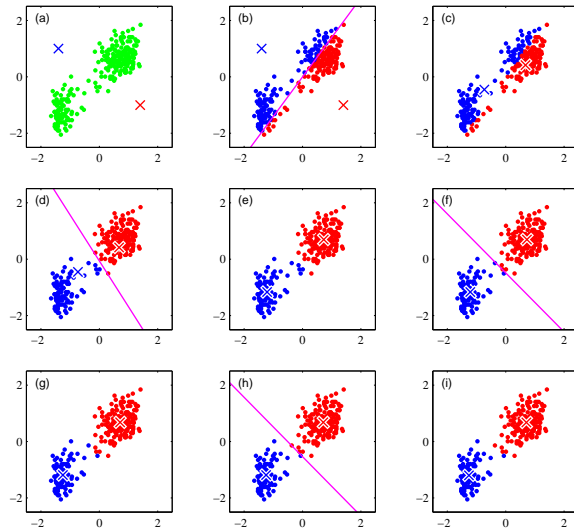
Lecture based on “Dive into Deep Learning” <http://D2L.AI> (Zhang et al., 2020)

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Digital Health & Machine Learning

Unsupervised Learning (k -means) Clustering

- Find subgroups in the data based on x only.
- Represent each cluster by the mean value of members.
- Example applications:
 - Find subgroups of patients with similar symptoms
 - Find genes with similar gene-expression patterns



Unsupervised Learning

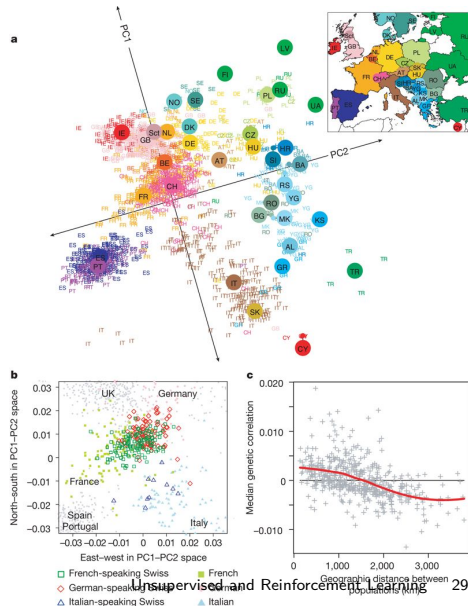
Representation learning

Principal Components Analysis

Project high-dimensional (large D) x on principal axes of variation (i.e. principal components).

Example applications:

- Determine population structure from genetic markers (SNPs)
- Data visualization



Unsupervised Learning

Representation learning

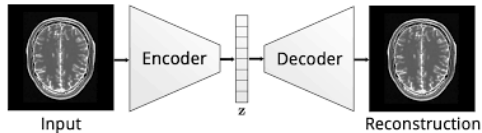
Autoencoders

Use pair of neural networks (encoder and decoder) to learn a numeric embedding z of x .

- encoder predicts z from x
- decoder predicts x from z

Example applications:

- Learn numeric embedding
- Compression
- De-noising
- Data visualization



embedding z

Unsupervised Learning

Generative Models

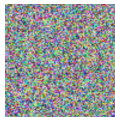
Models:

- Variational Autoencoders
- Generative adversarial networks

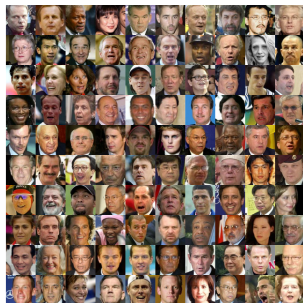
Applications:

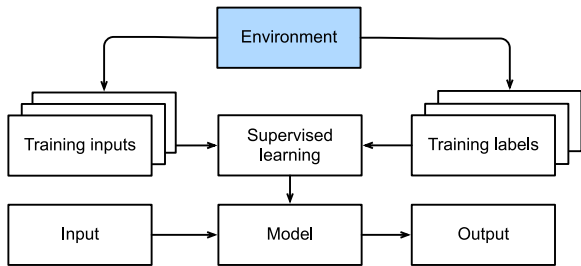
- Image synthesis
- Image super-resolution (MRI, microscopy)
- Probabilistic modeling

Noise $\sim N(0,1)$



Generative
Model





How do we expect the environment to behave?

Does it ...

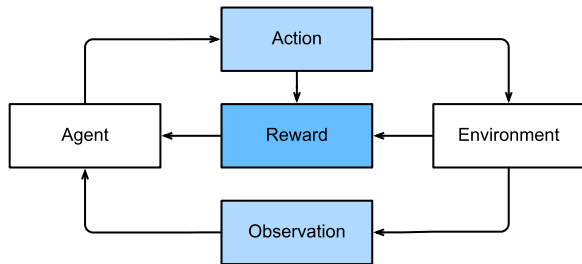
- Remember what we did previously?
- Want to help us, e.g., a user reading text into a speech recognizer?
- Want to beat us, i.e., an adversarial setting like spam filtering (against spammers) or playing a game (vs an opponent)?
- Not care?
- Have shifting dynamics

Does future data always resemble the past or do the patterns change over time?

- naturally
- in response to our tools?

Interacting with the environment

Reinforcement learning



Deep reinforcement learning applies deep neural networks to RL.

- **deep Q-network** that beat humans at Atari games using only the visual input
- **AlphaGo** dethroned the world champion at Go

Unsupervised Learning and Reinforcement Learning

Summary

- Unsupervised Learning
 - Clustering
 - Representation Learning
 - Generative Models
- Interacting with the environment