

# Deep Learning - un pas important vers l'apprentissage autonome des machines

iCoSys  
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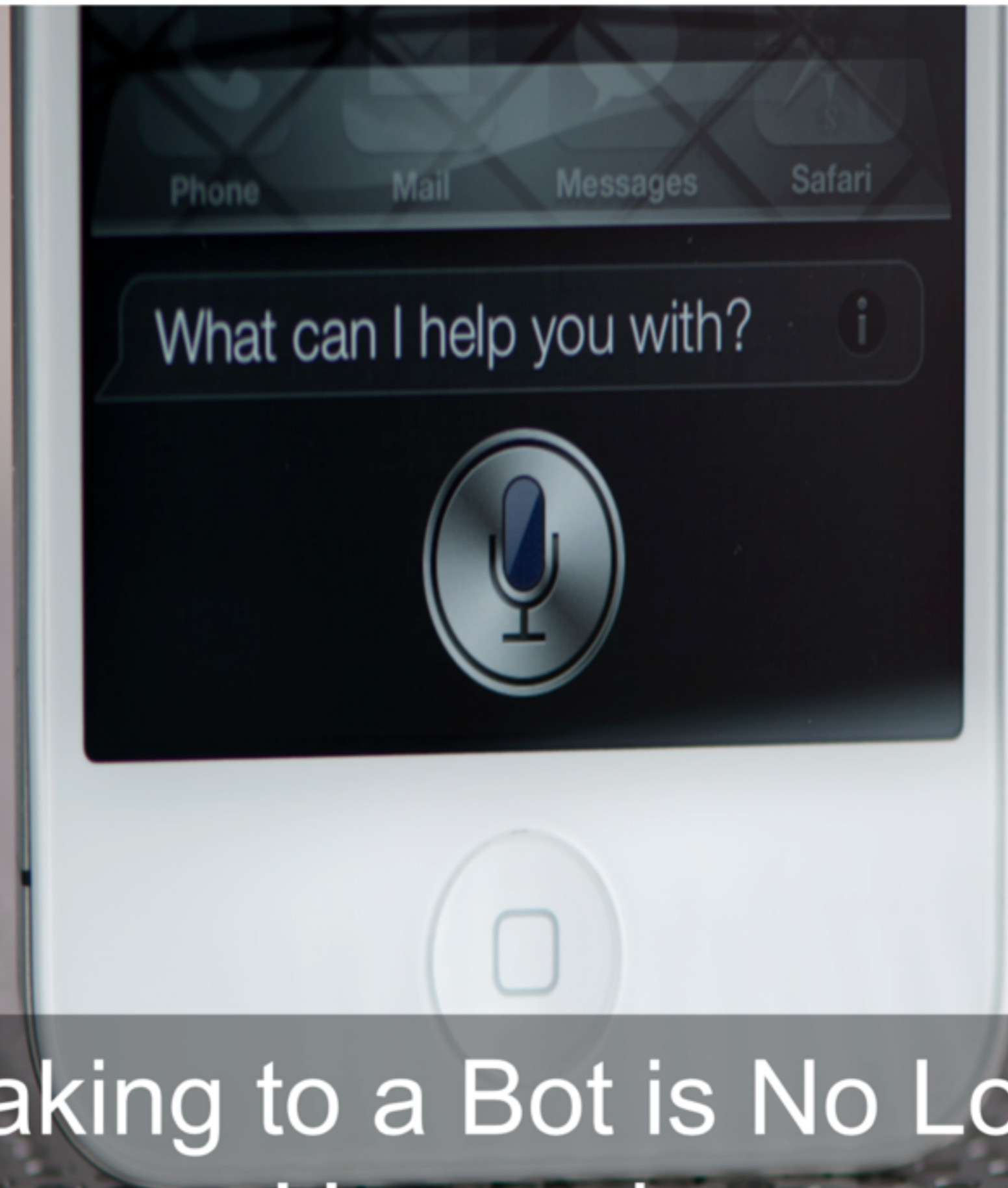


# Cars are now driving themselves...

(far from perfectly, though)







Speaking to a Bot is No Longer  
Unusual...

Borrowed from J. Bengio,  
Deep Learning Workshop IDIAP 2016

# March 2016: World Go Champion Beaten by Machine

A new revolution seems to be in the work after the industrial revolution.

Devices are becoming intelligent.

And Deep Learning is at the epicenter of this revolution.



Borrowed from J. Bengio, Deep Learning Workshop IDIAP 2016





# What is deep learning?

- New trend in the field of machine learning
- At the convergence of

**Larger quantities of data**  
text, audio, images, videos, ...

**New algorithms**  
DBN, RBM, CNN ...

Deep  
Learning

**Better computer performance**  
GPU, distributed computing ...



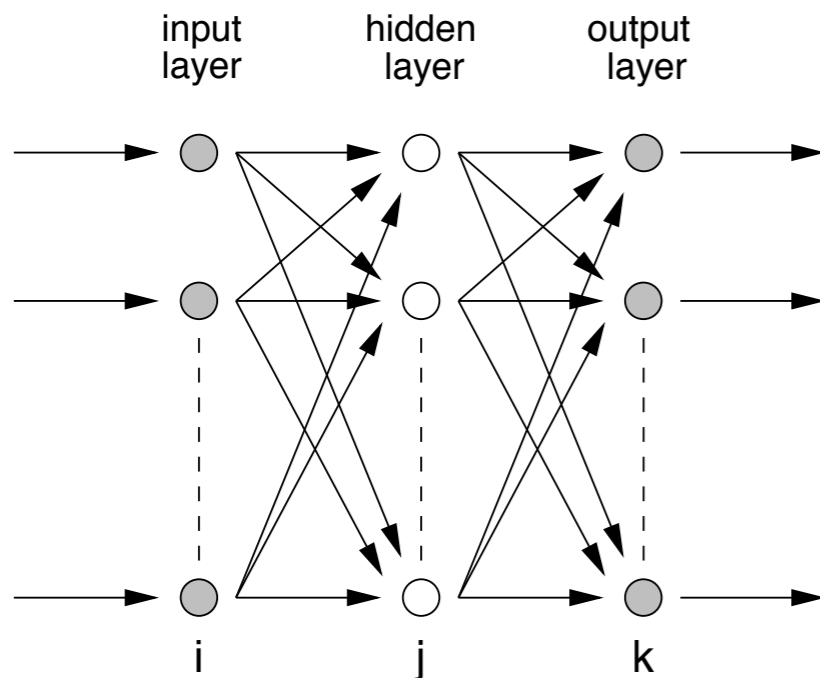
Breaking news: 4x Tesla K80 coming soon @ [www.daplab.ch](http://www.daplab.ch)



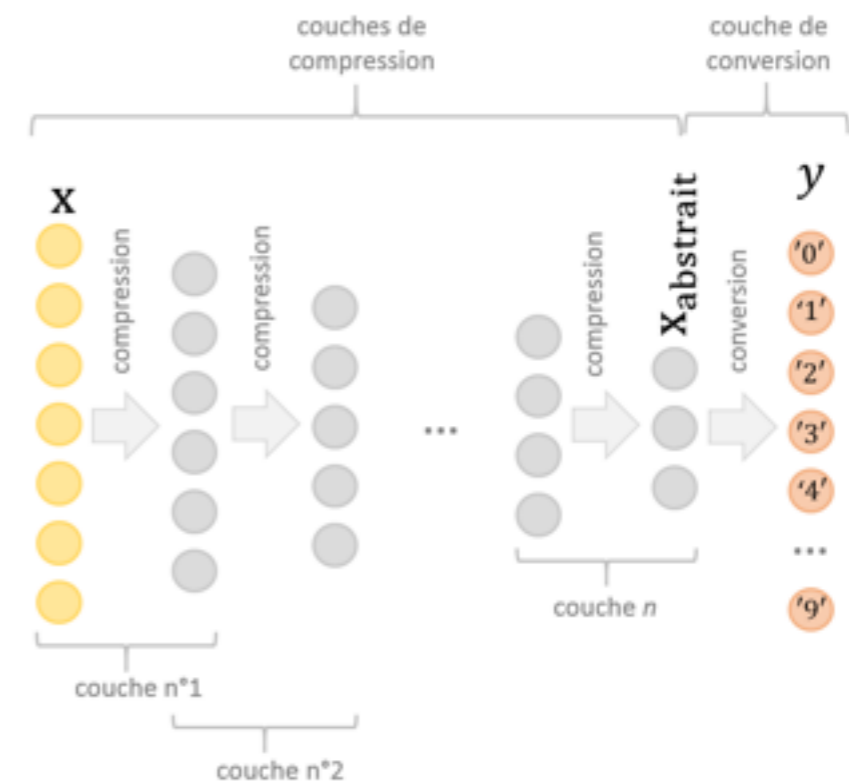


# What is deep learning?

- Neuronal architecture with many layers and neurons



1990's  
500 neurons  
50K params  
months of training on cpu



2010's  
500'000 neurons  
60M params  
days/weeks of training on gpu



# Face recognition task







# The problem has actually three parts

- Face detection — where is the face?
- Feature extraction — what defines a face?
- Face matching — who is associated to this face?

<https://www.betafaceapi.com/demo.html>

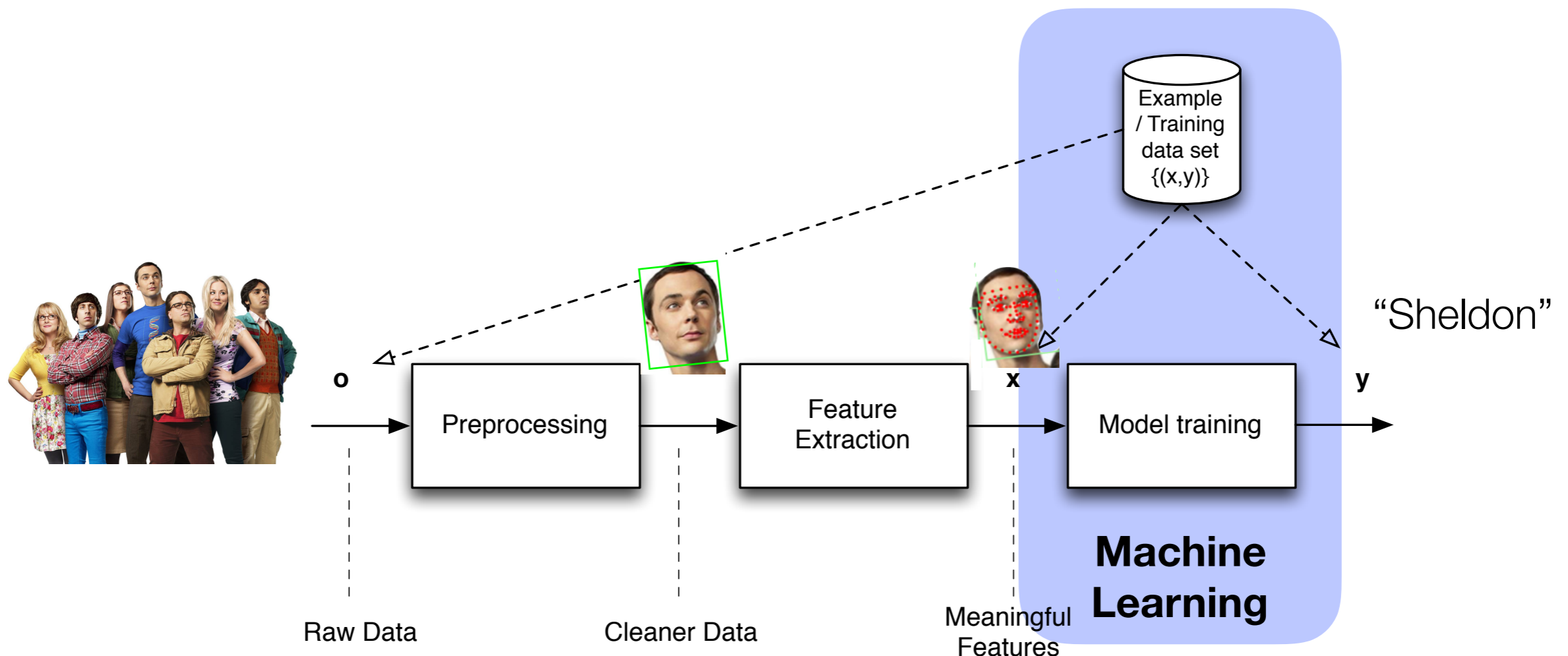






# Supervised machine learning

With **supervised learning**, the goal is to extract some relevant features  $\mathbf{x}$  from raw observation data  $\mathbf{o}$  and to learn a **mapping** from inputs  $\mathbf{x}$  to outputs  $\mathbf{y}$  given a set of example data called the **training set**.







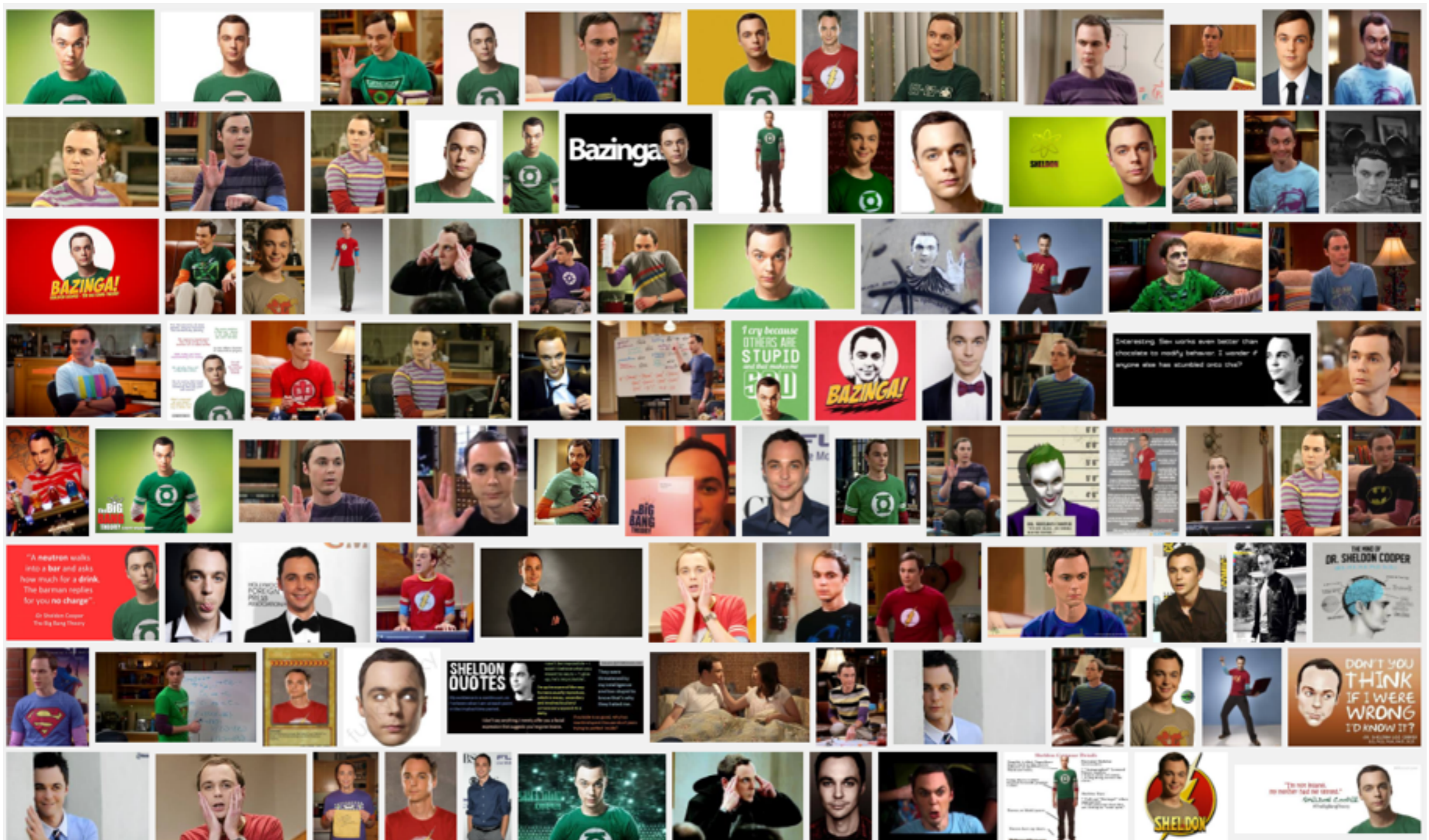
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# Training with many examples of Sheldon, Raj, Penny,...



**PROBLEM 1:** We need **large quantities of human validated examples!** ...and this is costly to build



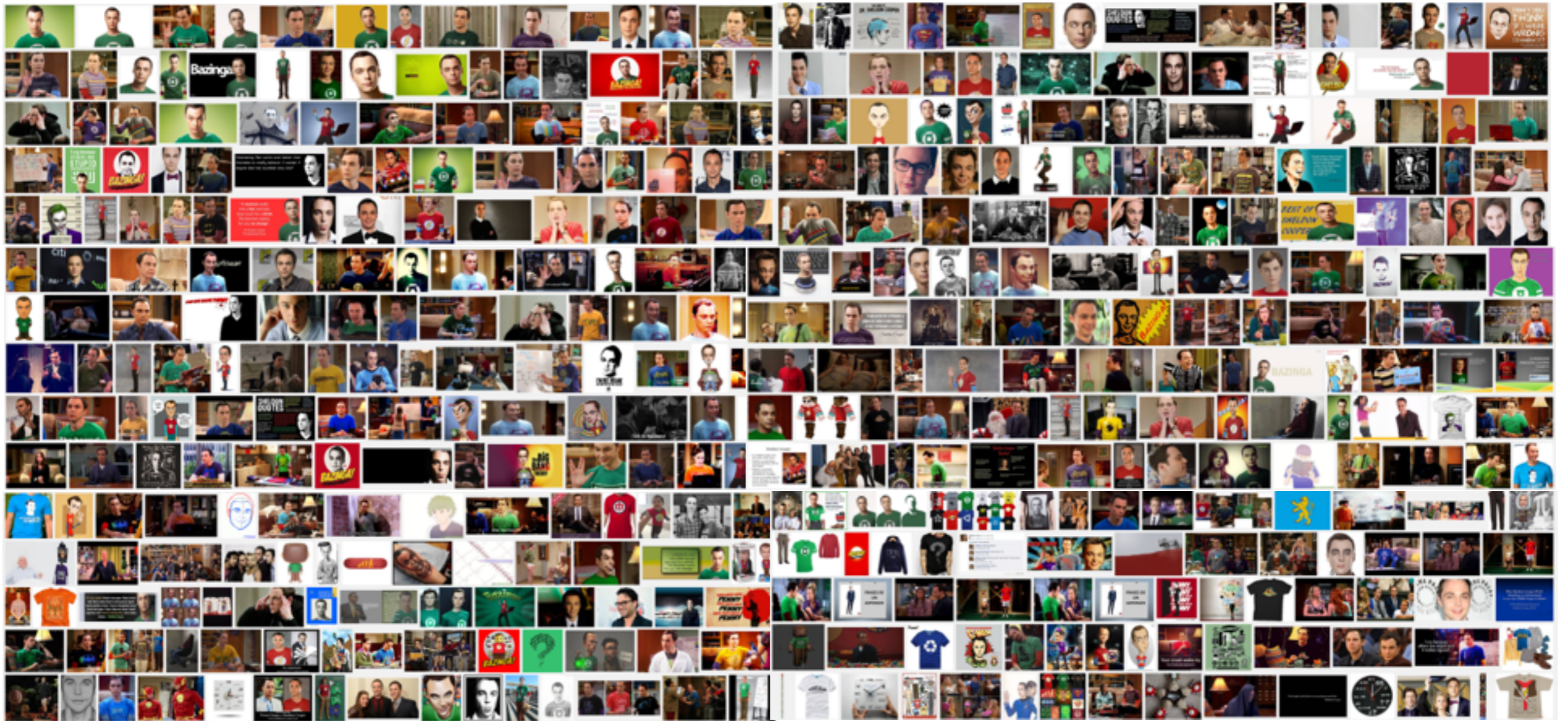


...

- Are we able to **generalise**?
- We have here more complex **variabilities** such as growing a barb, changing hair style, ...
- This means we need more examples or to find ways to look for *invariant features* ...



We will need more examples of Sheldon, Raj, Penny,...



**PROBLEM 2:** Because of the variabilities, we will need even **more data** and **complex mapping functions**.

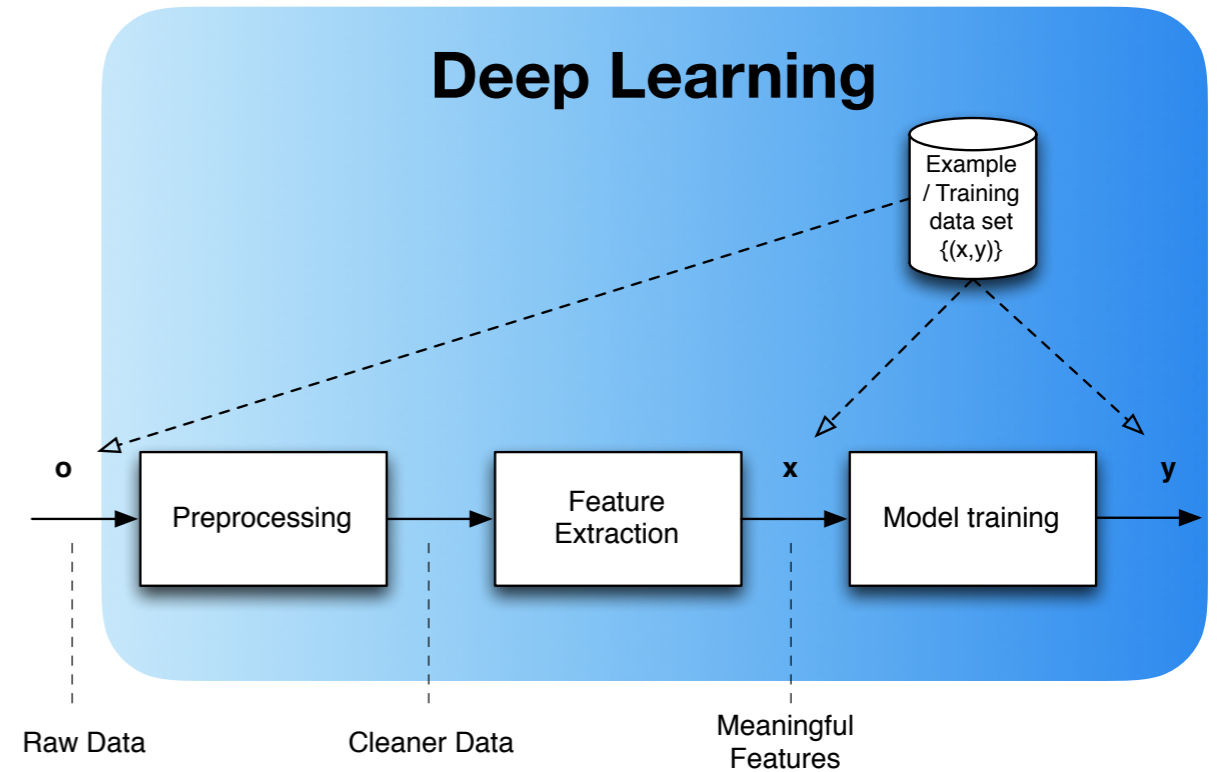
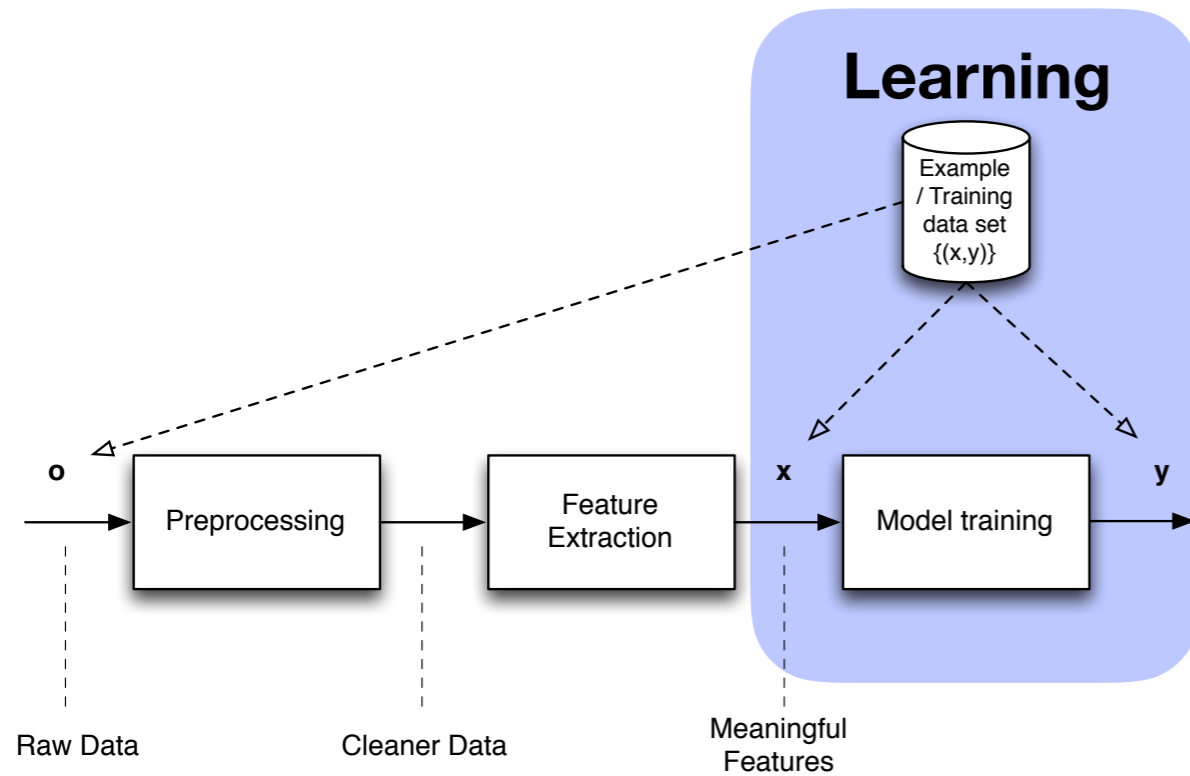
**PROBLEM 3:** We usually spend a lot of time to hand-craft interesting compact features, this is called **feature engineering**





# Deep Learning answers these problems:

Learn the feature extraction using unsupervised learning algorithms



## Supervised learning problems

1. We need **large quantities of human validated examples!** ...and this is costly to build
2. We need **even more data and complex mapping functions to learn variabilities** of the input
3. We usually need a lot of hand-crafted **feature engineering** to compute interesting/compact inputs  $x$

## Deep learning answers

1. Let's use all the labelled data and unlabelled data
2. Let's use deep neural networks
3. Let's **learn the feature extraction in unsupervised learning mode**





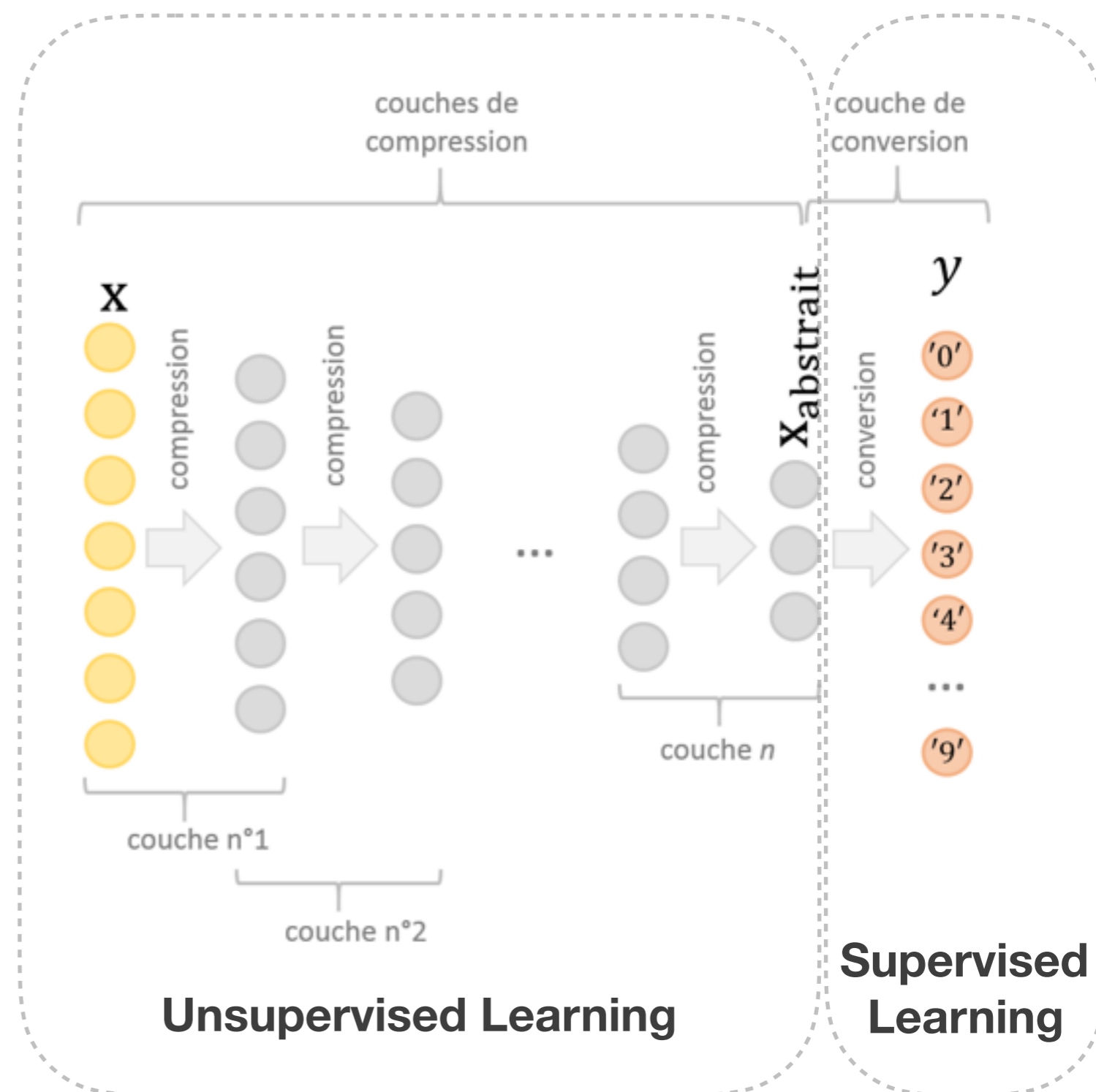




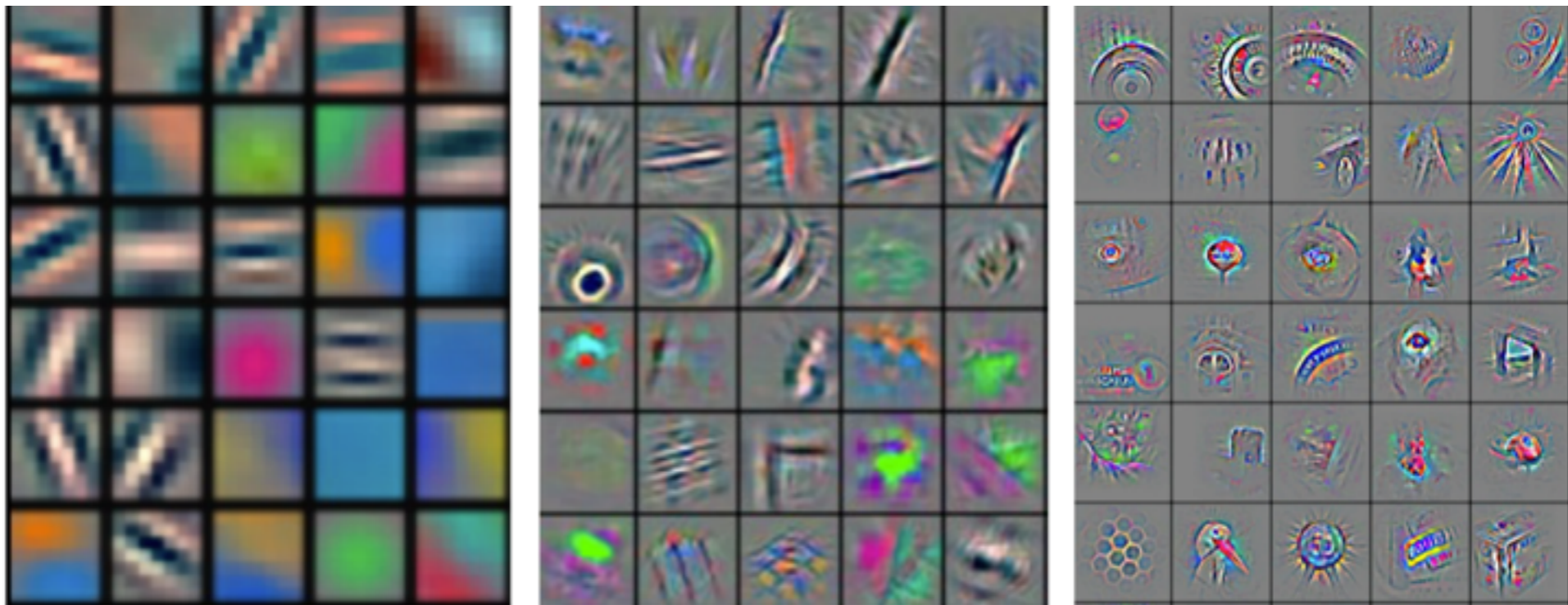
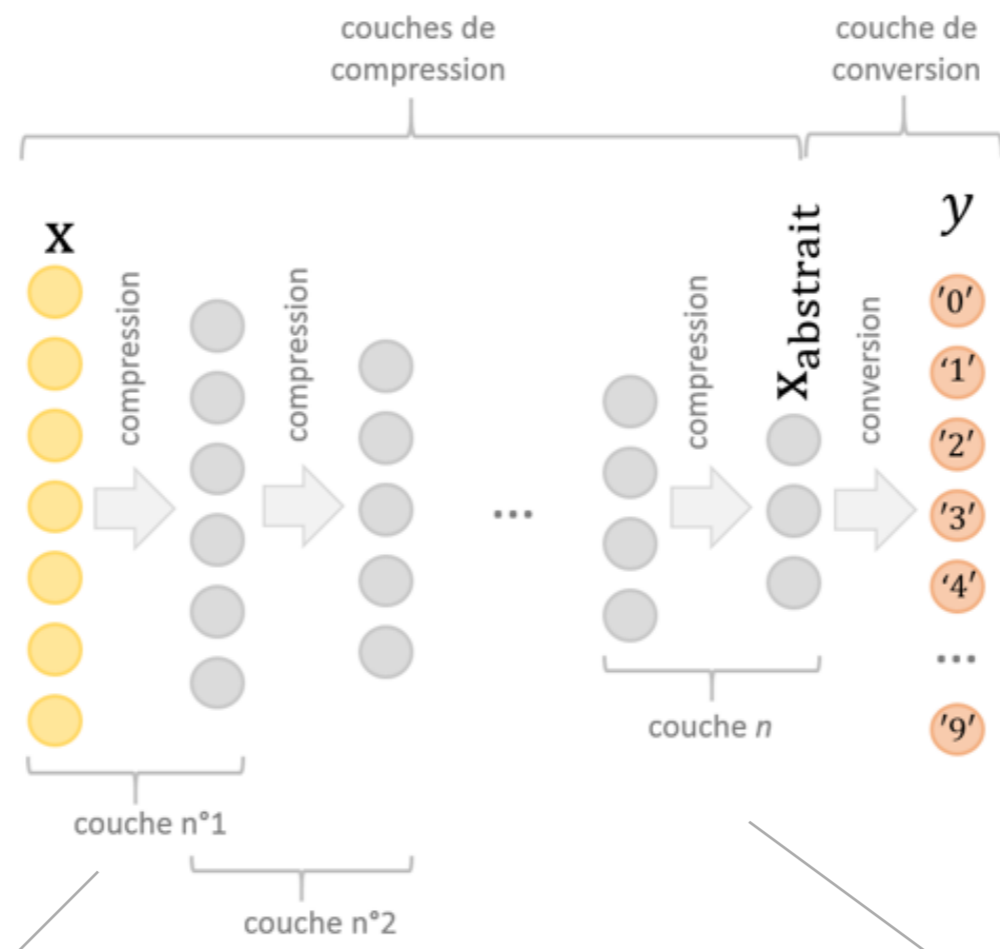
# Deep learning system

With **unsupervised learning**, the goal is to discover **interesting structures** from inputs

The **supervised learning** phase is as before, learning a **mapping** from features to useful outputs.







Feature visualization of convolutional net trained on ImageNet from [Zeiler & Fergus 2013]





# Conclusions

Scalability of learning  
on very large data sets

Ability to learn the feature  
extraction in unsupervised  
mode and classification in  
supervised mode

**Larger quantities of data**  
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Deep  
Learning

**Better computer performance**  
GPU, distributed computing ...

Ability to train complex  
mapping functions

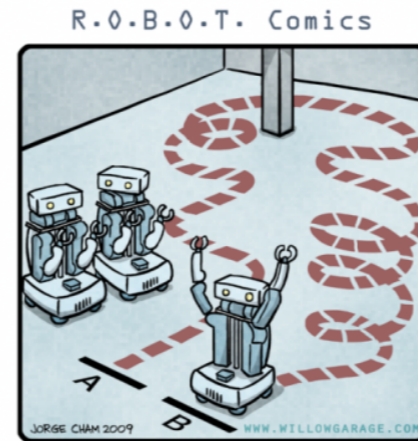




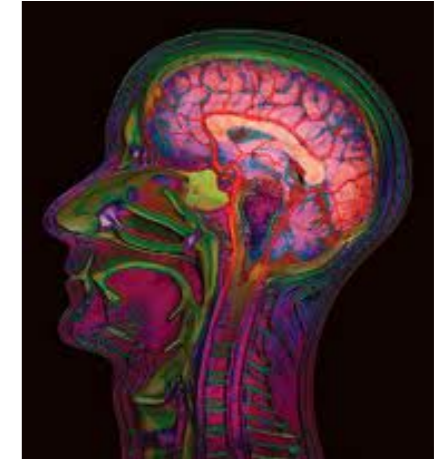
# Deep learning - many applications



Recognition



Planning



Diagnosis



Robot Control



Prediction



# iCoSys

- Institute of Complex Systems
  - Created end 2012
  - For now: clear focus on computer science arm of Complex Systems
  - 5 profs - 10 scientific collaborators
  - 5 PhD students

*All things being in a chain of influence and in a chain of causes,  
i deem it impossible to know the whole without knowing the parts  
or to know the parts without knowing the whole.*

*Blaise Pascal, Thinkings.*



## Distributed Computing

- > Large-scale parallel and distributed architectures
- > Middleware for parallel and distributing programming
- > Parallel and distributed high performance applications
- > Large mobile and sensor networks

## Intelligent Data Analysis

- > Machine learning
- > Big data analysis
- > Signal processing
- > Algorithms

## Sustainable ICT for Smart Living

- > Data management and processing for sensor networks
- > Web of Things
- > Energy efficient IT
- > IT for energy efficiency