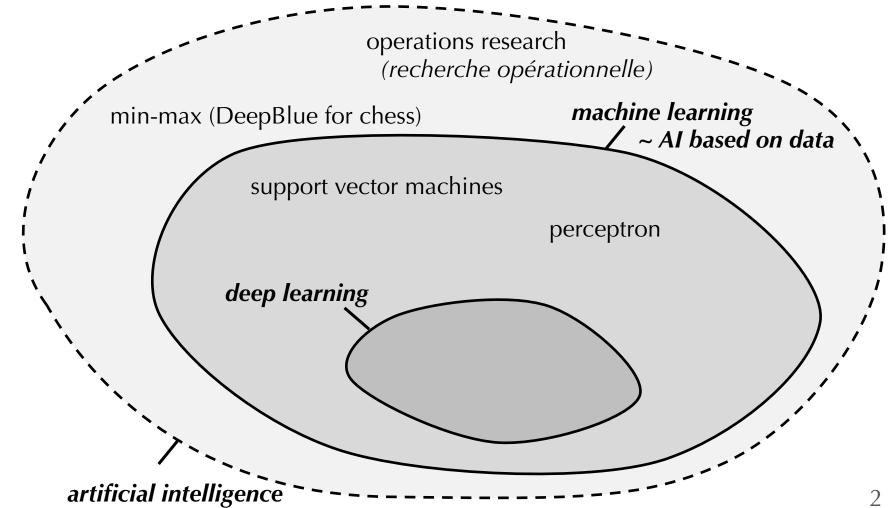
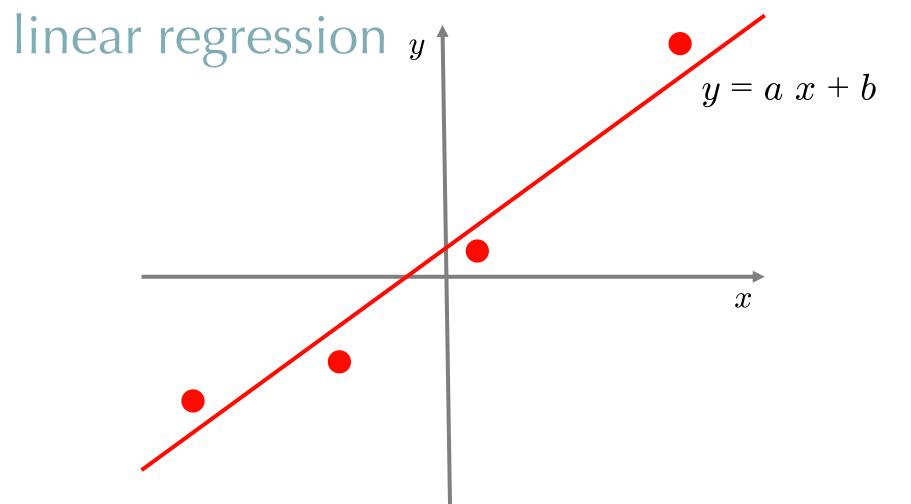
deep learning and LLMs

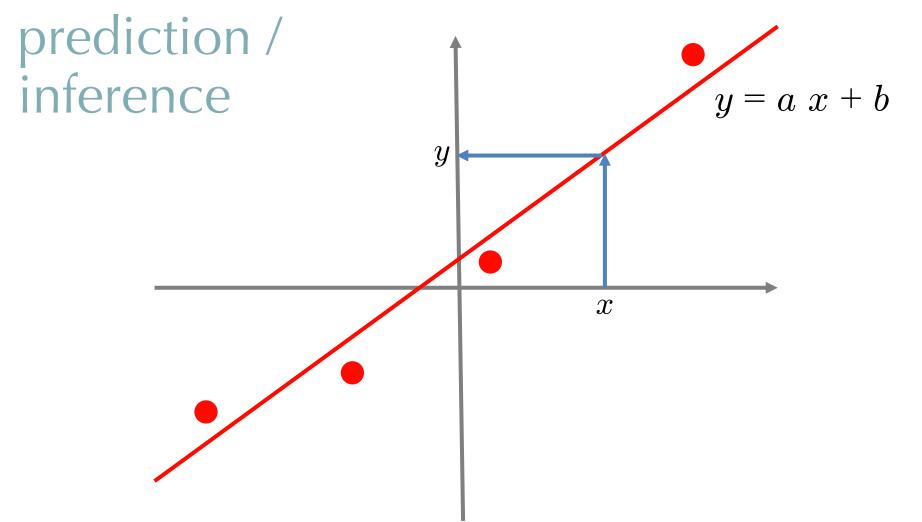
Vincent Lepetit

Ecole Nationale des Ponts et Chaussées, France

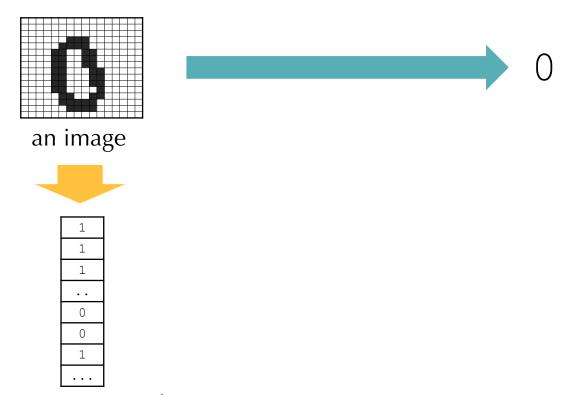




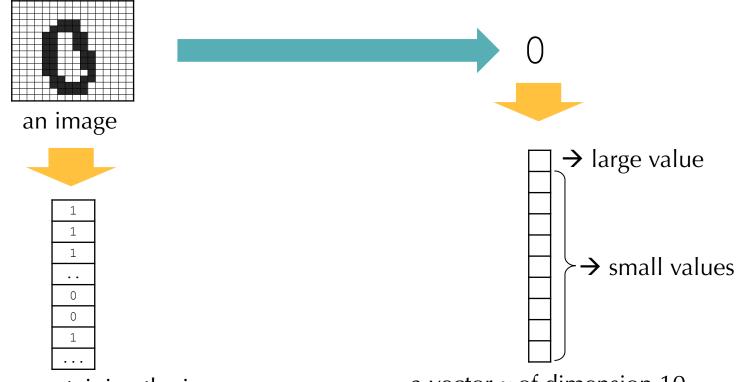




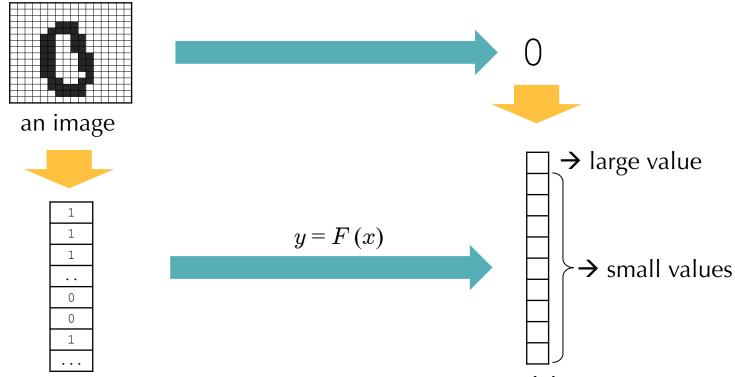




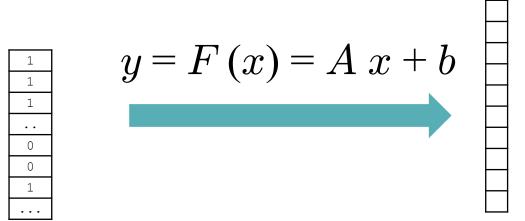
a vector x containing the image



a vector *x* containing the image



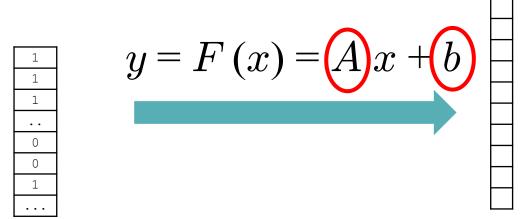
a vector x containing the image



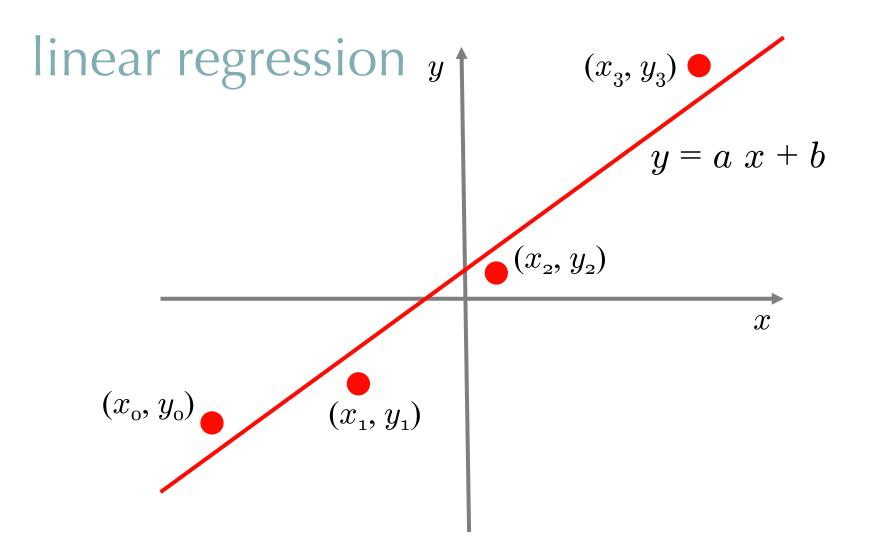
a vector x containing the image

a vector y of dimension 10

how can we find A and b?

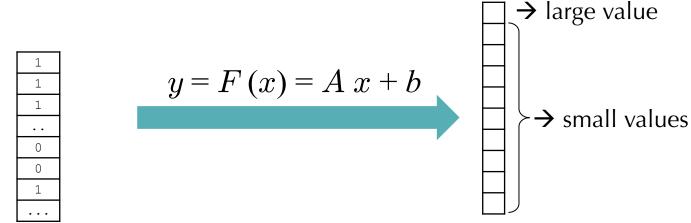


a vector x containing the image



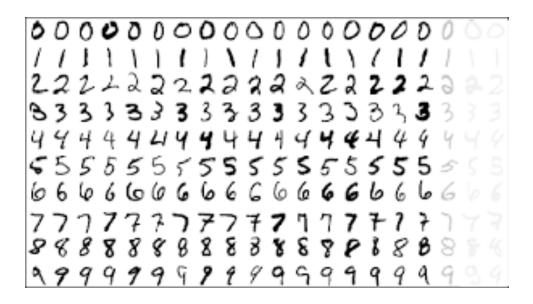
how can we find A and b?

$$x_0 = \boxed{}, y_0 = 0$$
 $x_1 = \boxed{}, y_1 = 1$ $x_2 = \boxed{}, y_2 = 2$



a vector x containing the image

training set (ensemble d'apprentissage):

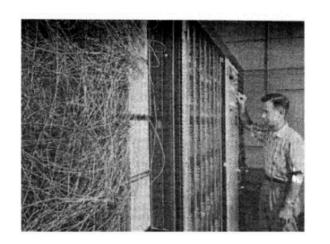


training (apprentissage), learning:

optimization to find the values of A and b

y = A x + b

 $\boldsymbol{\mathcal{X}}$

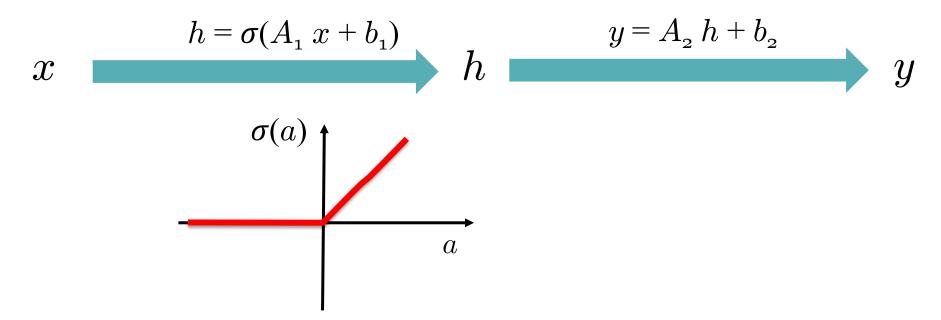


This was done in the 50ies!

Can we do better?

can we do better?

can we do better?



can we do better?



h is difficult to interpret

deep networks are black boxes



training (optimization) becomes more difficult (but we have good methods now).

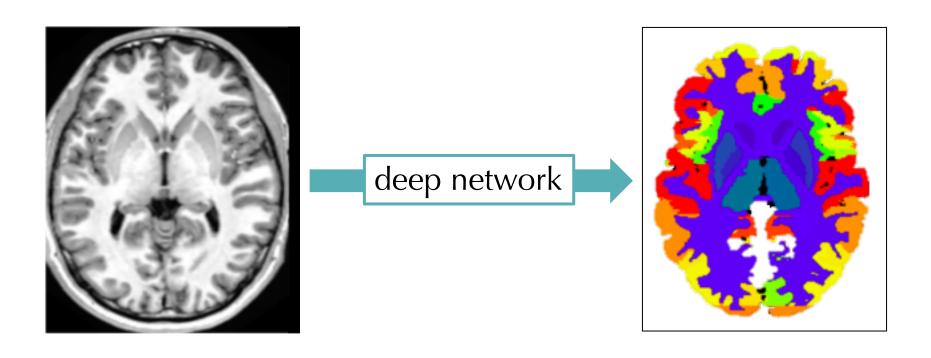
Developed in 1992 by Yann LeCun.



training (optimization) becomes more difficult (but we have good methods now)



image analysis



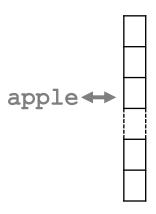
Natural Language Processing

She is eating a green apple



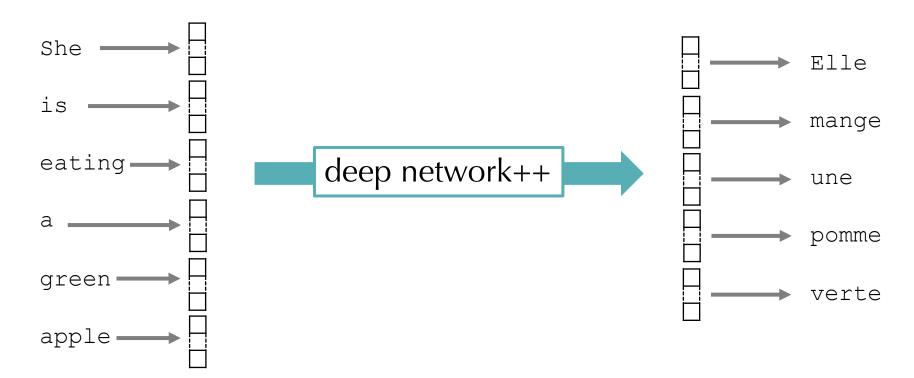
Elle mange une pomme verte

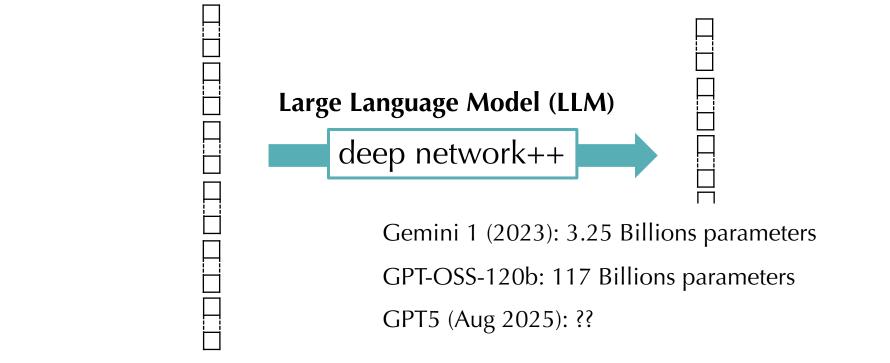
representing words with vectors



vector representing the word 'apple' dimension ~ 4096

Natural Language Processing





for long texts, predicts one part of the text at a time ("next word predictor")

25

how to train an LLM?

- ▶ use virtually any digital written document (books, forums, ..)
- ► training set dedicated to chat (question + expected answer)
- ► "Reinforcement Learning from Human Feedback"

► for anything text, also code, even actions

less and less "hallucinations" & mistakes

but still happen (and will keep happening):

make a list of 5 grocery items counting down from 5 to 1

Here's your countdown list of grocery items:

- 5. Apples
- **6.** Bread
- 7. Milk
- 8. Eggs
- 9. Coffee

"[LLMs] are a bit like students who have learned the material by rote but haven't really built deep mental models of the underlying reality" (Yann LeCun)