



# Deep Learning og Computer Vision

Chris Holmberg Bahnsen



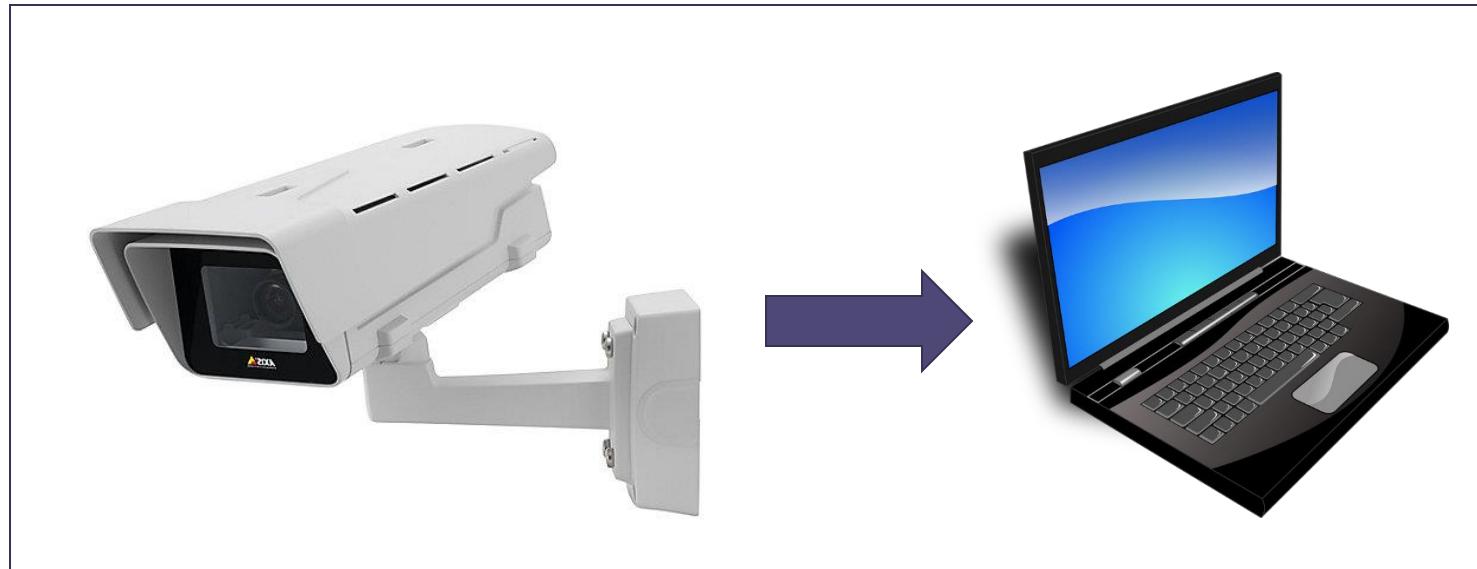
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# Baggrund

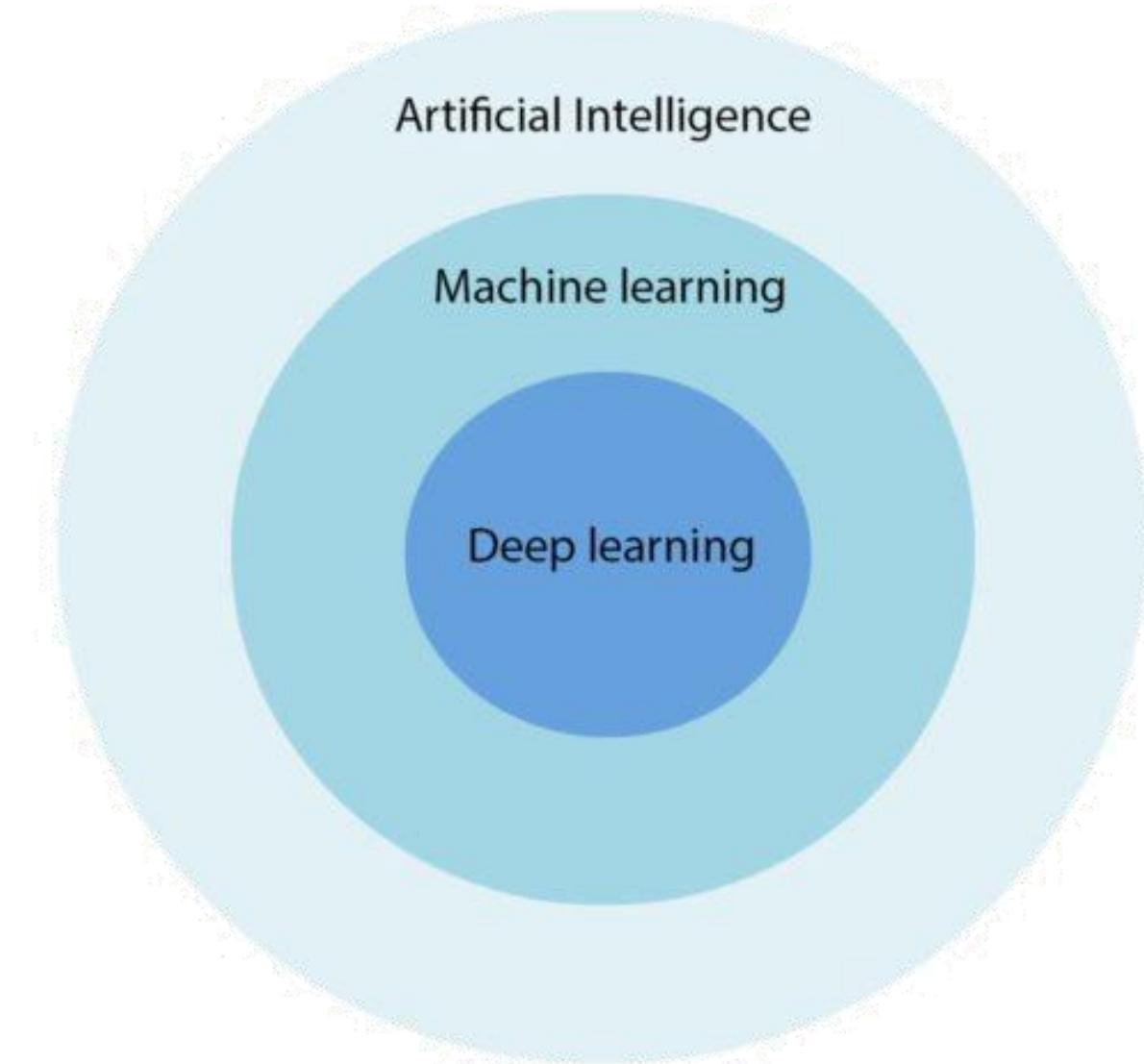
## Hvem er jeg?

- Cand. polyt. Elektronik & IT, 2013
- Ph.d.-afhandling i robust  
trafikovervågning, 2018
- Visual Analysis of People  
Laboratory, AAU
- Postdoc 2019 -



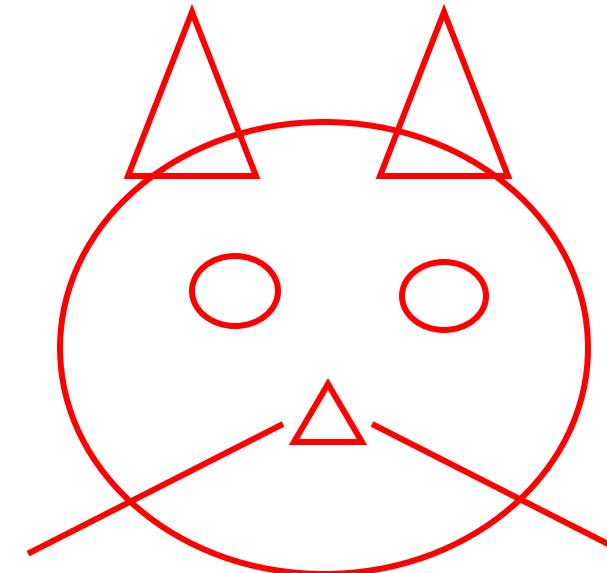
# Hvad er AI?

- AI: ~1940s
- Machine Learning: ~1990s
- Deep Learning: ~2010s



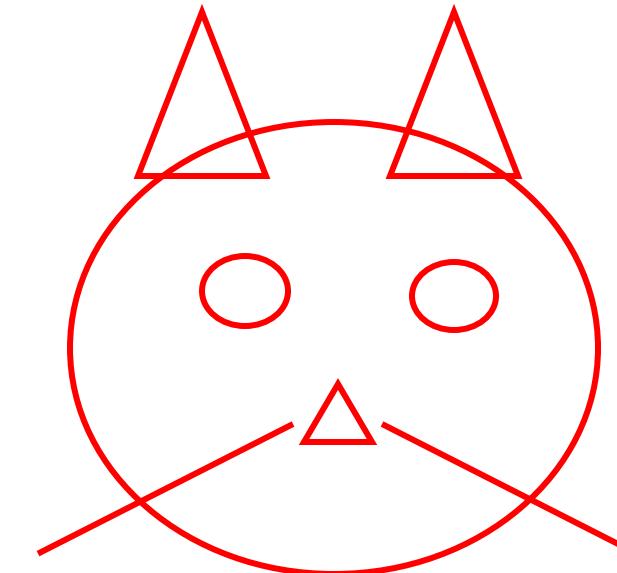
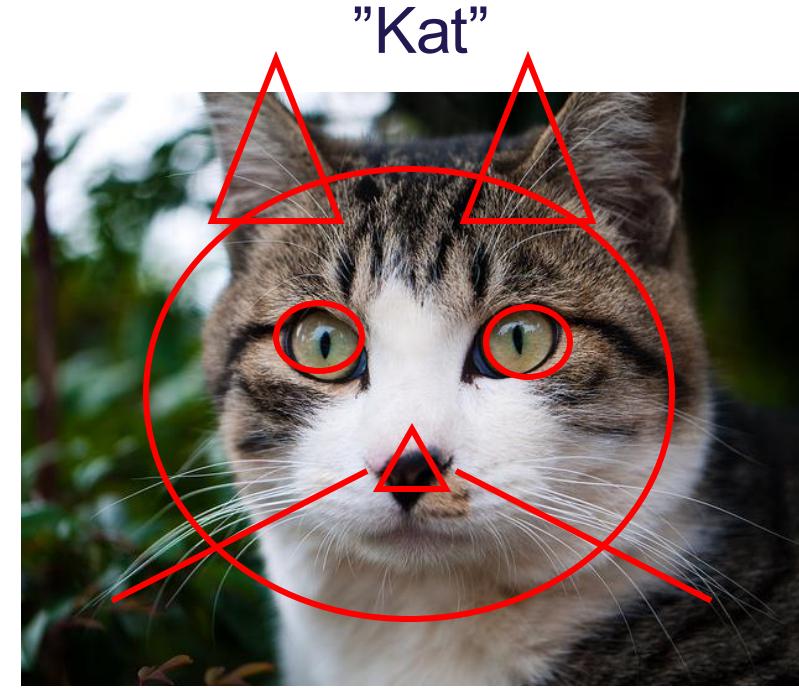
# Hvad er AI?

- Opgave: Genkend en kat
- Løsning: Regelbaseret model af kattens dele



# Hvad er AI?

- Opgave: Genkend en kat
- Løsning: Regelbaseret model af kattens dele



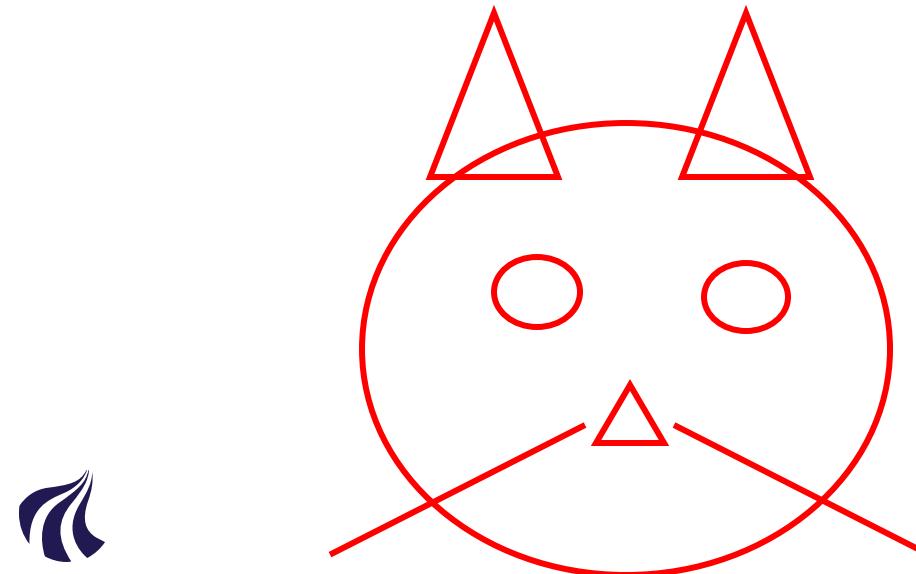
# Hvad er AI?

- Duer ikke ved forskellige positioner
- Katte er utroligt deformerbare

✗



?



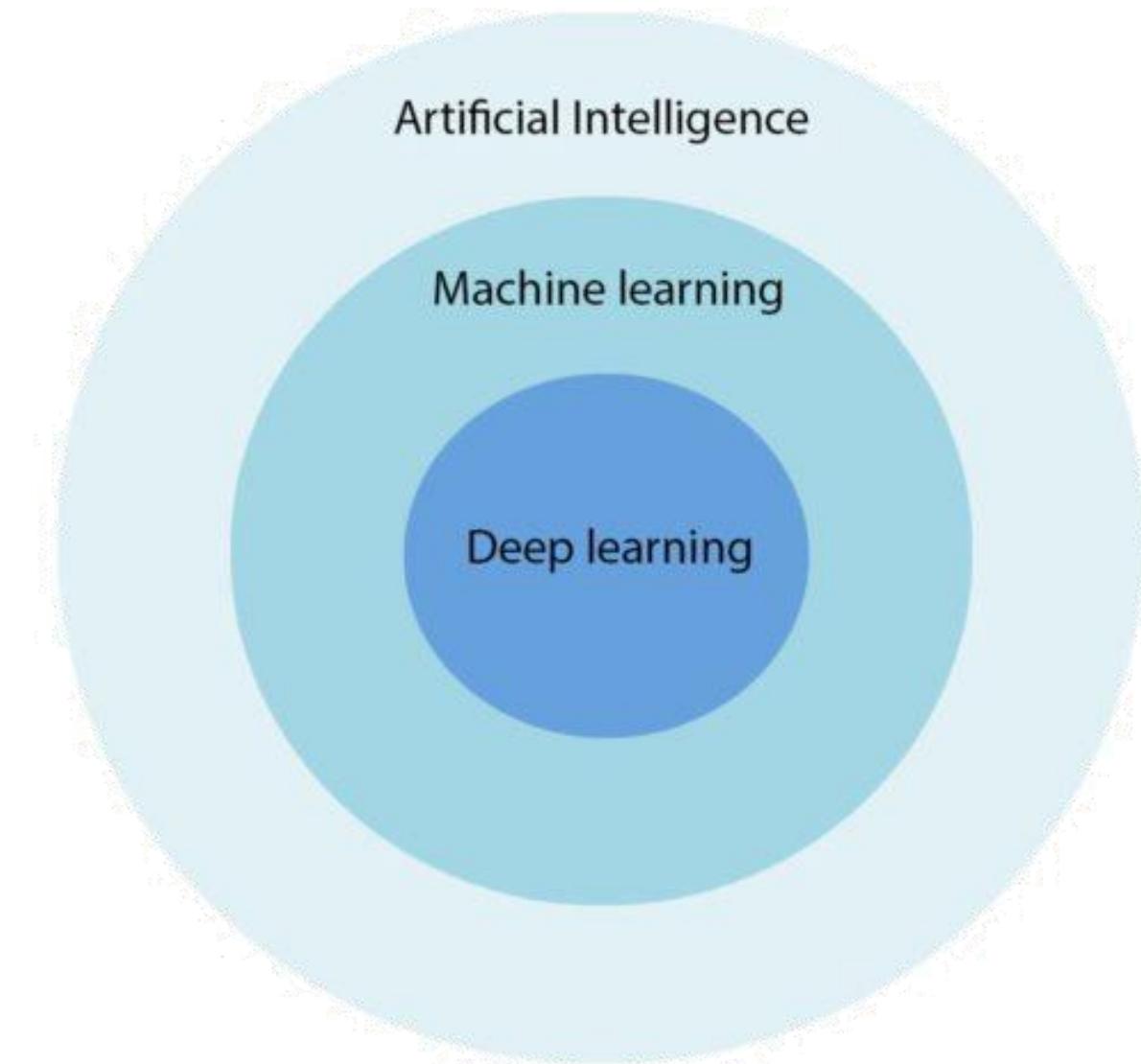
# Hvad er AI?

- Umuligt at definere en god model for alle kattedeformationer
- Vi vil i stedet *lære* vores model i stedet for at hårdkode den



# Hvad er AI?

- AI: ~1940s
- Machine Learning: ~1990s
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# Hvad er machine learning?

- ▶ Eksempel: Kend forskel på Per and Lene
- ▶ Fremgangsmåde: Find karakteristiske features

"Per"



"Lene"



# Hvad er machine learning?

- Eksempel: Kend forskel på Per and Lene
- Mængden af hår?

"Per"



"Lene"



---

Hår-ratio

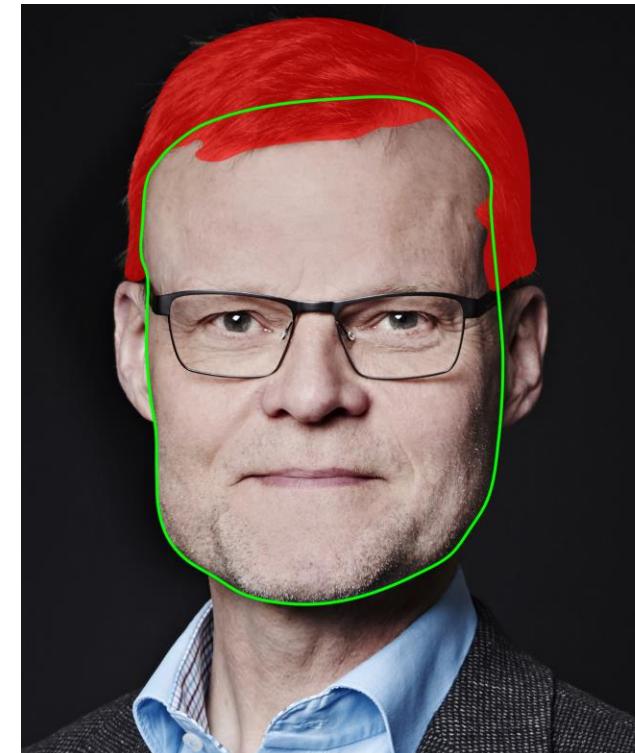
0,09

0,24

# Hvad er machine learning?

- ▶ Eksempel: Kend forskel på Per and Lene
- ▶ Mængden af hår?
- ▶ Ansigtets cirkularitet?

"Per"



"Lene"



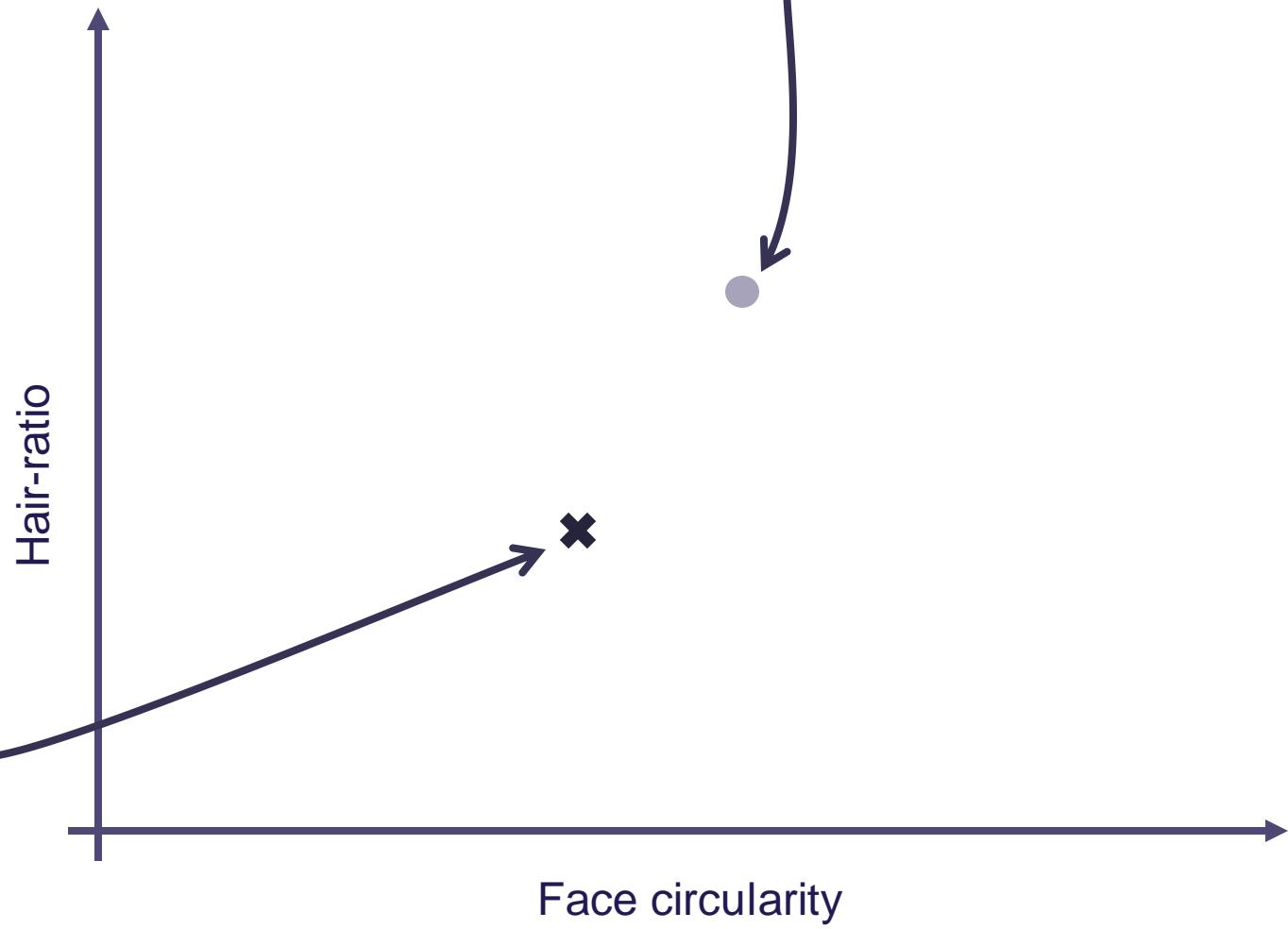
Hair-ratio  
Circularity

0,09  
0,79

0,24  
0,87

# Hvad er machine learning?

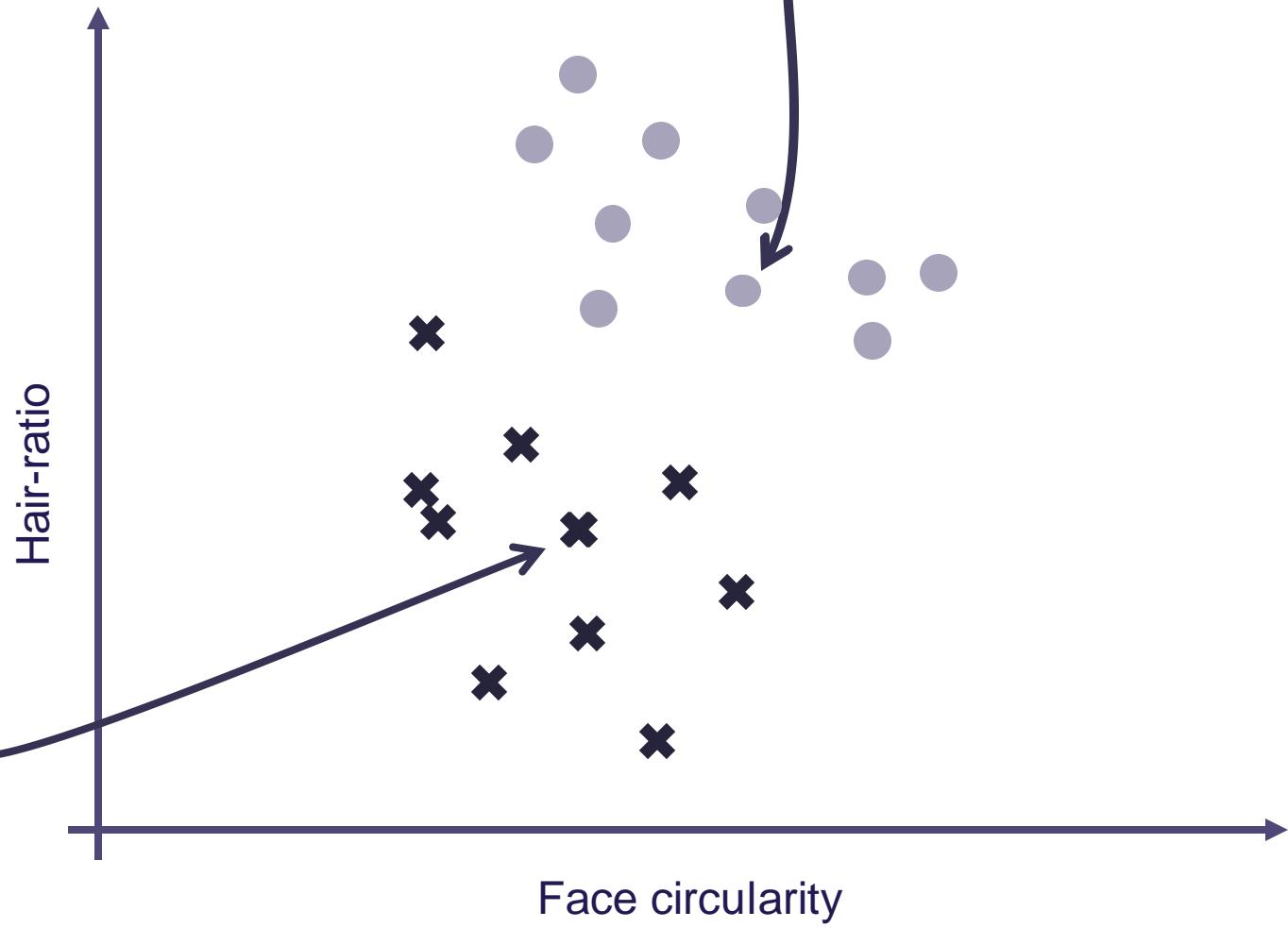
- Eksempel: Kend forskel på Per og Lene
- Mængden af hår?
- Ansigtets cirkularitet?
- Feature-rum



✖ Per  
● Lene

# Hvad er machine learning?

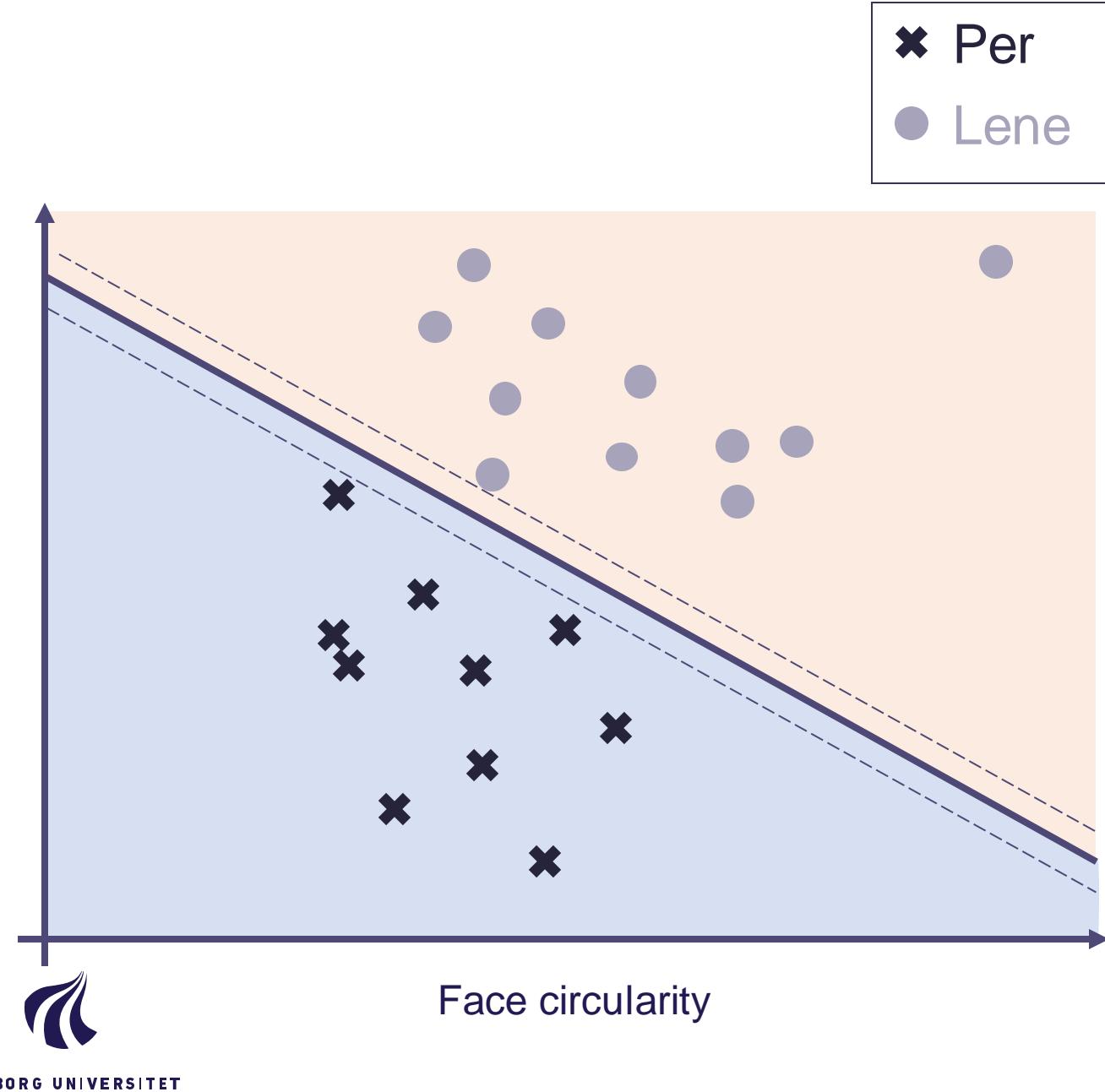
- Eksempel: Kend forskel på Per og Lene
- Mængden af hår?
- Ansigtets cirkularitet?
- Flere billeder



✖ Per  
● Lene

# Hvad er machine learning?

- Eksempel: Kend forskel på Per og Lene
- Mængden af hår?
- Ansigtets cirkularitet?
- Find en linje der adskiller de to områder



# Hvad er machine learning?

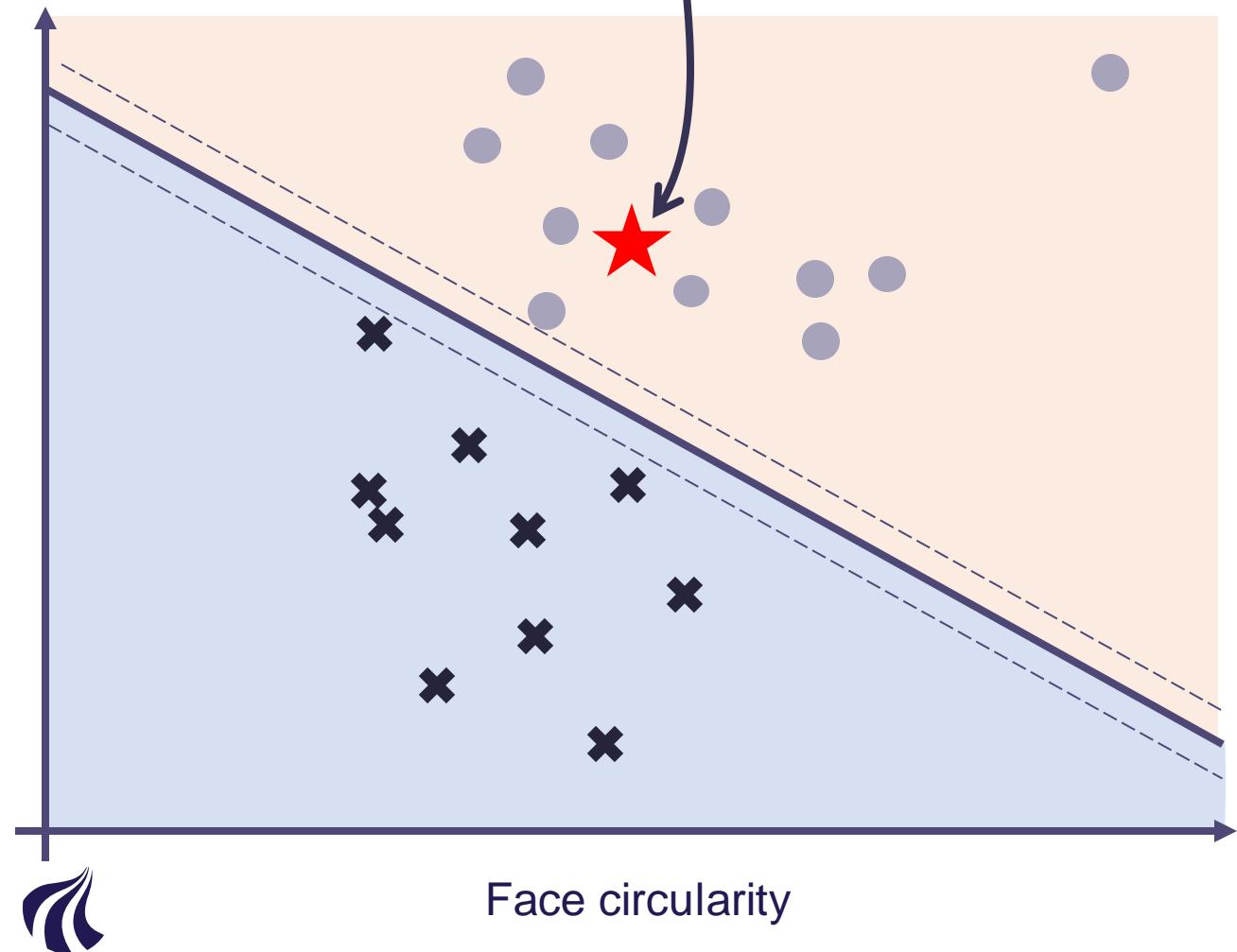
## ► Nyt billede – hvem er det?

- Udtræk features
- Hvor er billedet i feature-rummet?
- Sammenlign med linjen
- Bestem hvem det er

## ► Det er machine learning

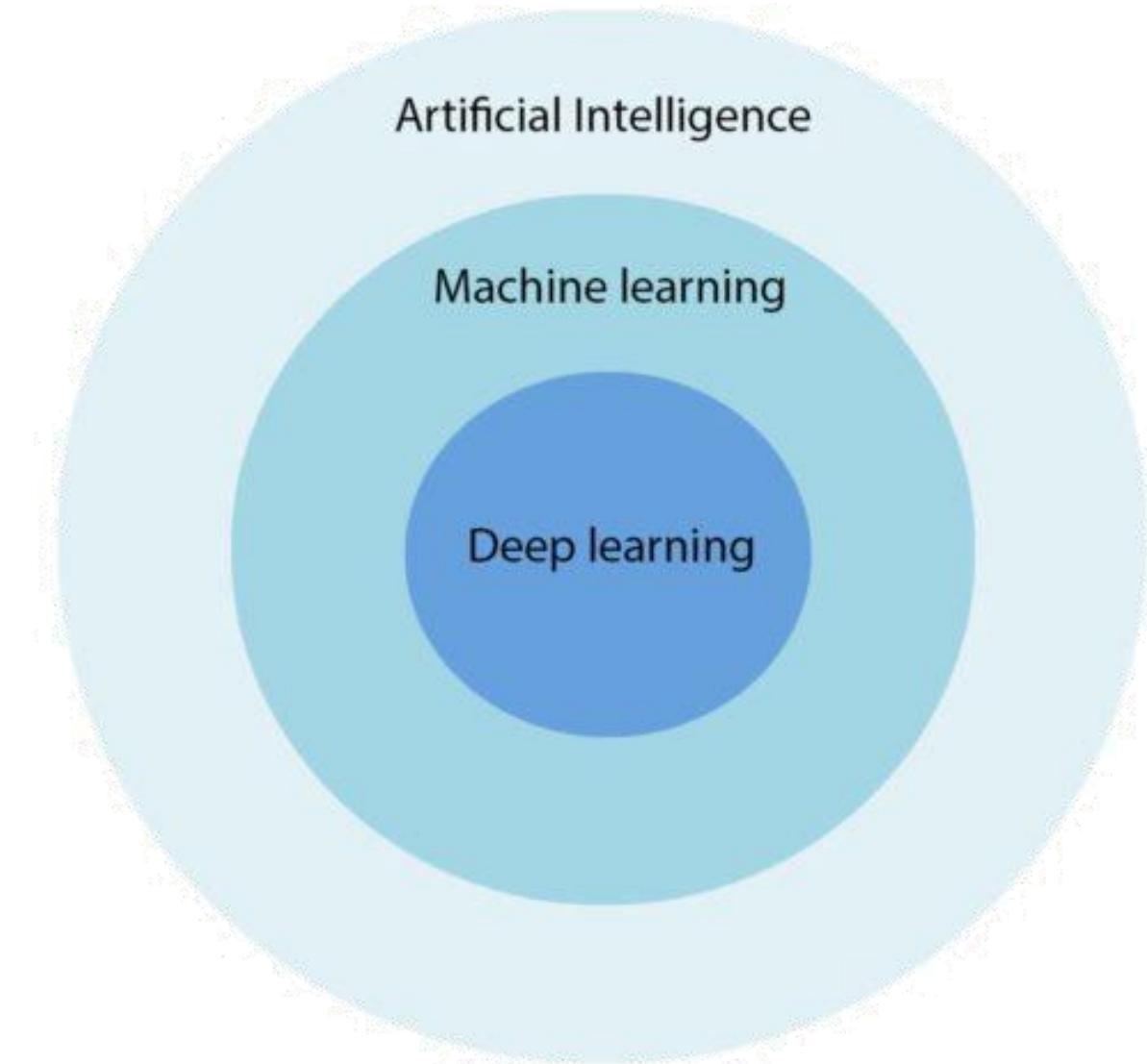


✖ Per  
● Lene



# Hvad er AI?

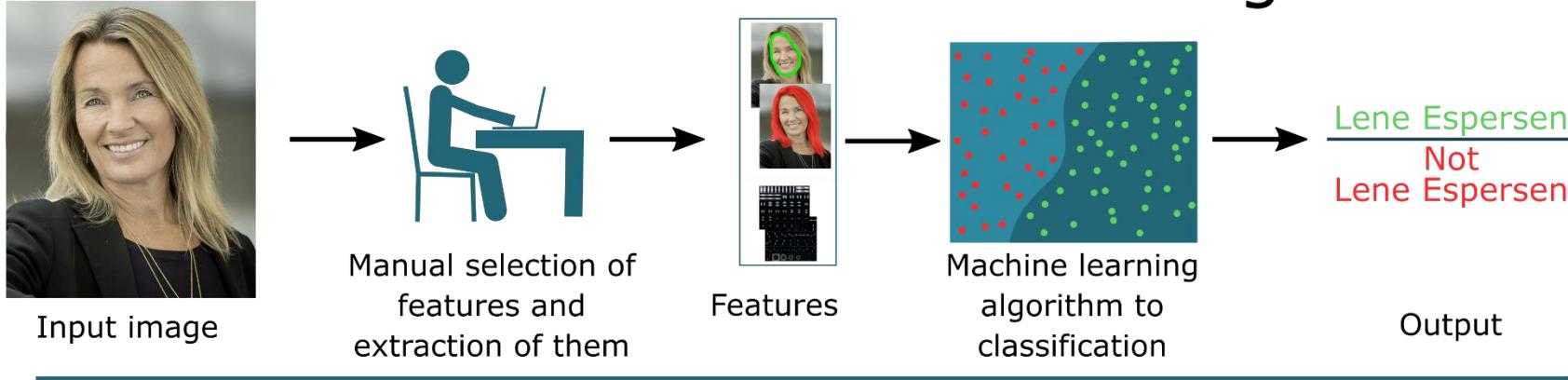
- AI: ~1940s
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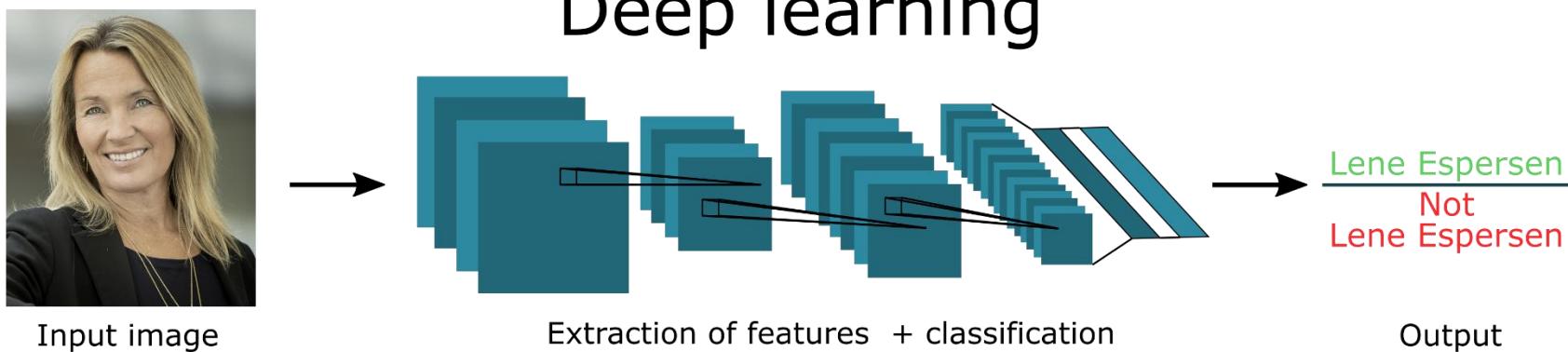
# Deep Learning

## Fra machine learning til deep learning

### Traditional machine learning



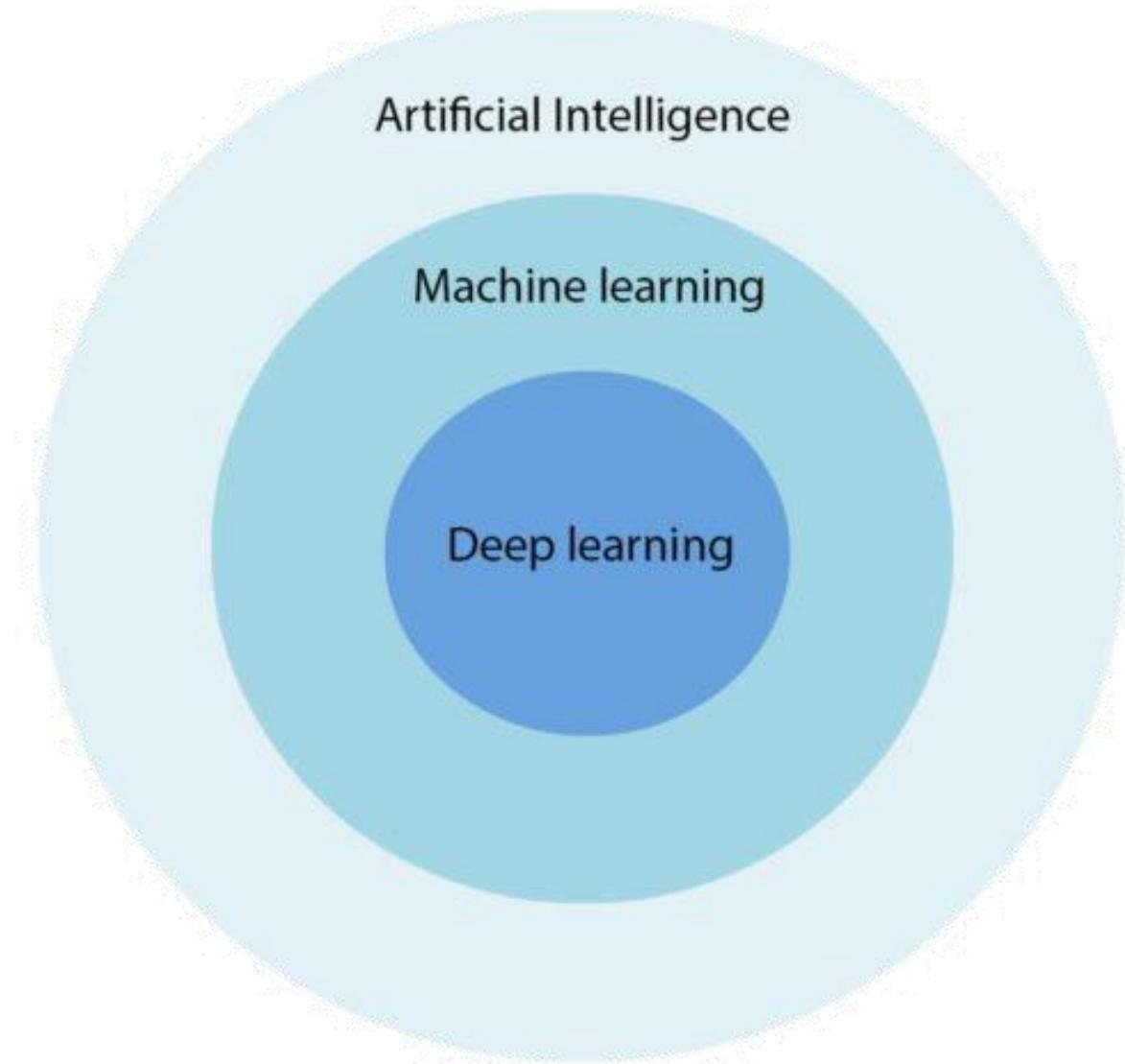
### Deep learning



# Deep Learning

## Den menneskelige hjerne

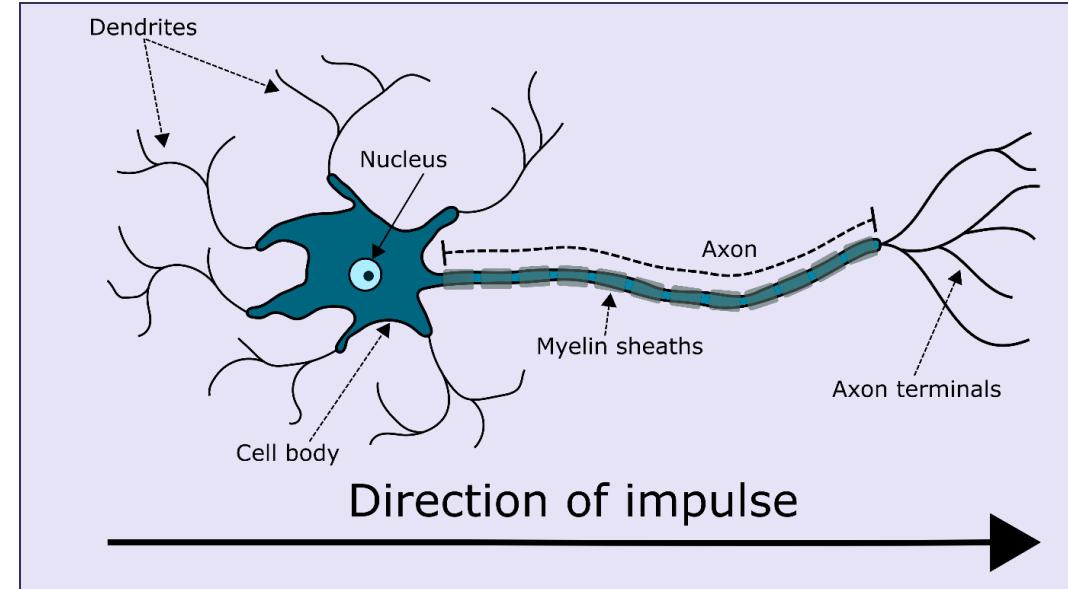
- Vores hjerne indeholder ca. 100 milliarder neuroner, der er organiseret i et netværk
- Et neutralt netværk er en machine learning-metode, der er inspireret af den menneskelige hjerne



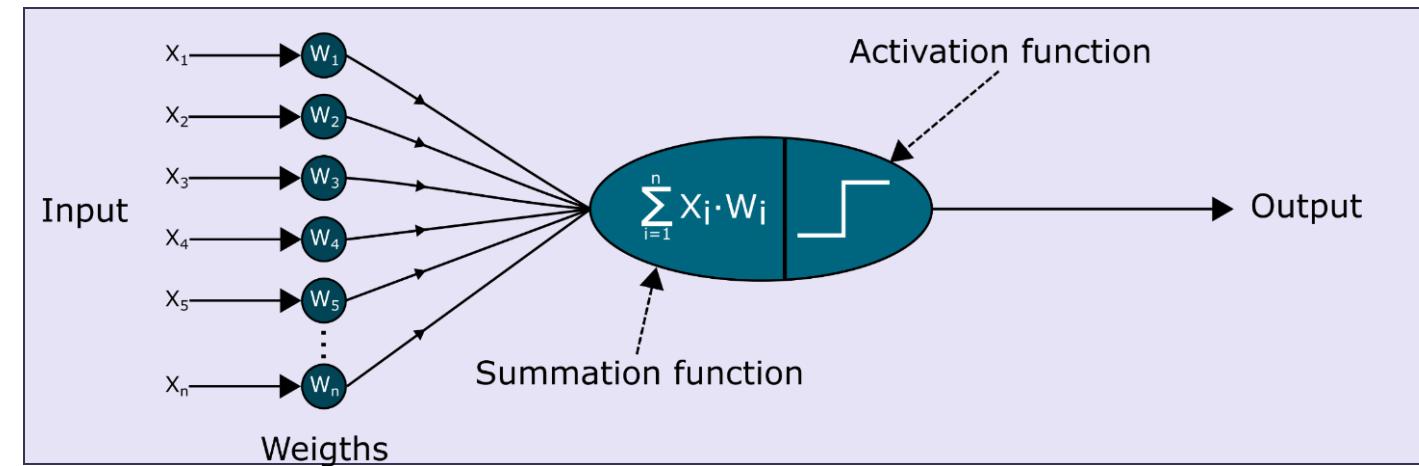
# Deep Learning

## Kunstigt neuralt netværk

Rigtig neuron

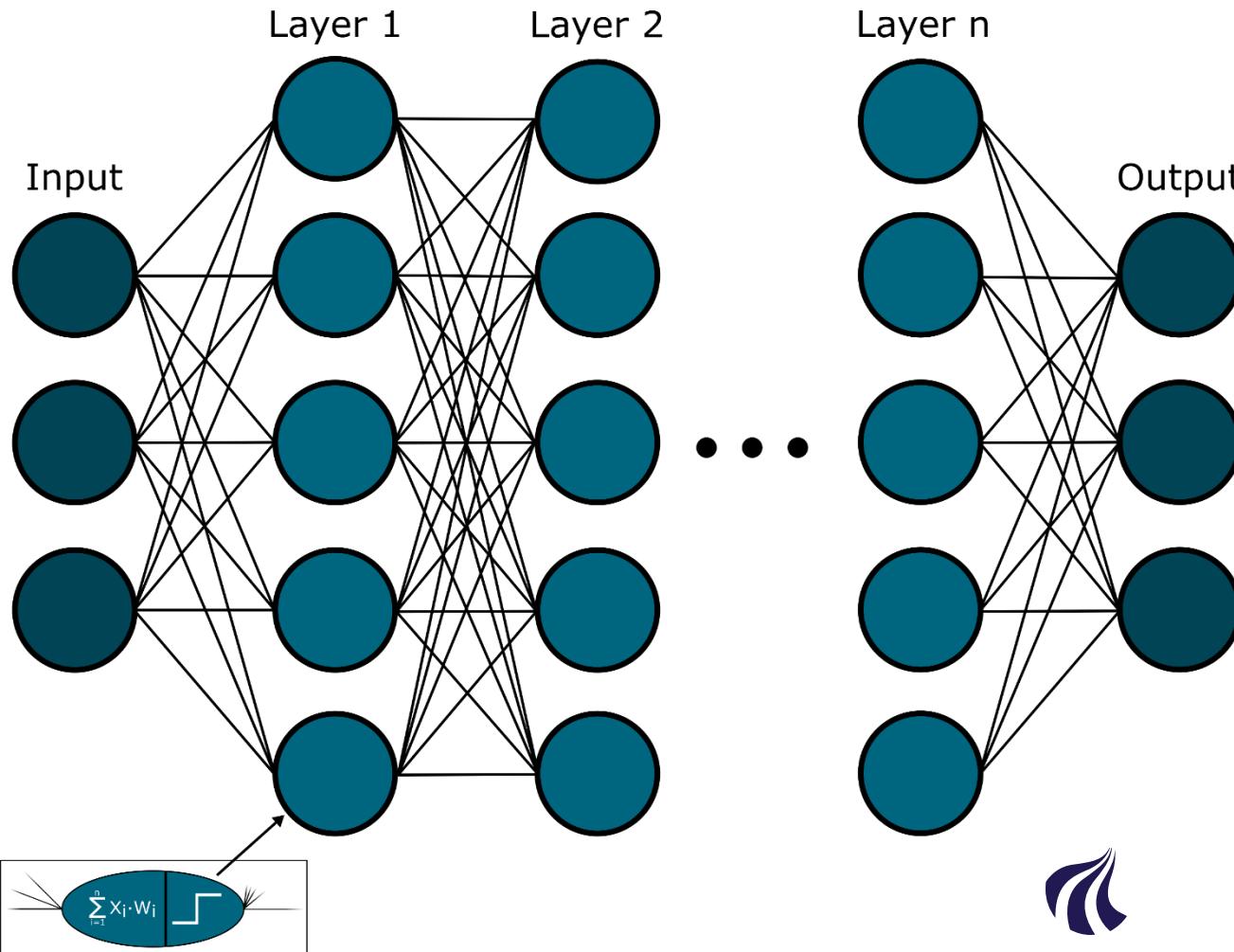


Kunstig neuron



# Deep Learning

## Kunstigt neuralt netværk

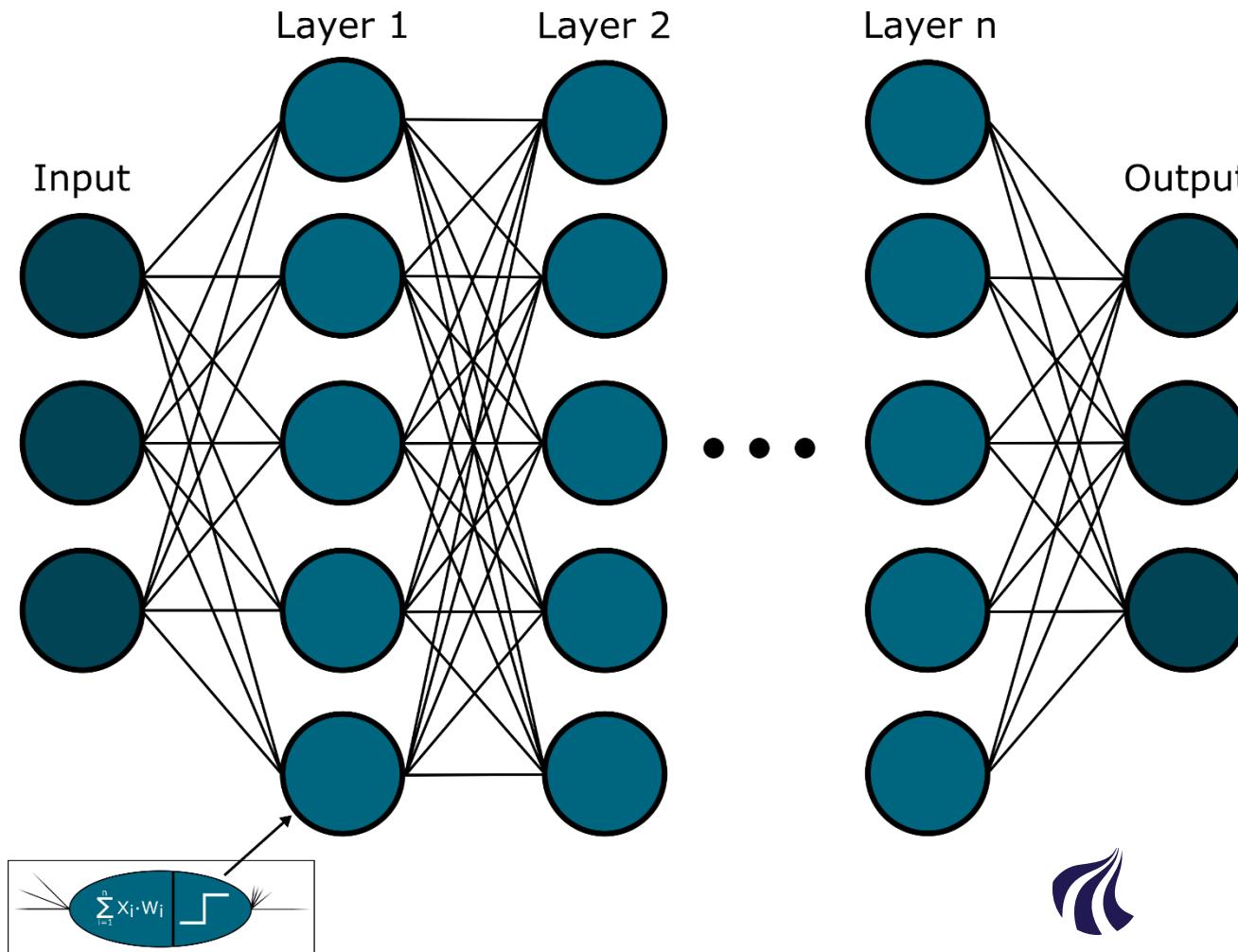


- ▶ Antallet af lag beskriver **dybden** af netværket
  - ▶ 5 – 150 lag
  - ▶ 1 million – 100 millioner parametre



# Deep Learning

## Kunstigt neuralt netværk



- Træning:

- Presenter **mange** kendte input-outputrelationer



→ "Per"



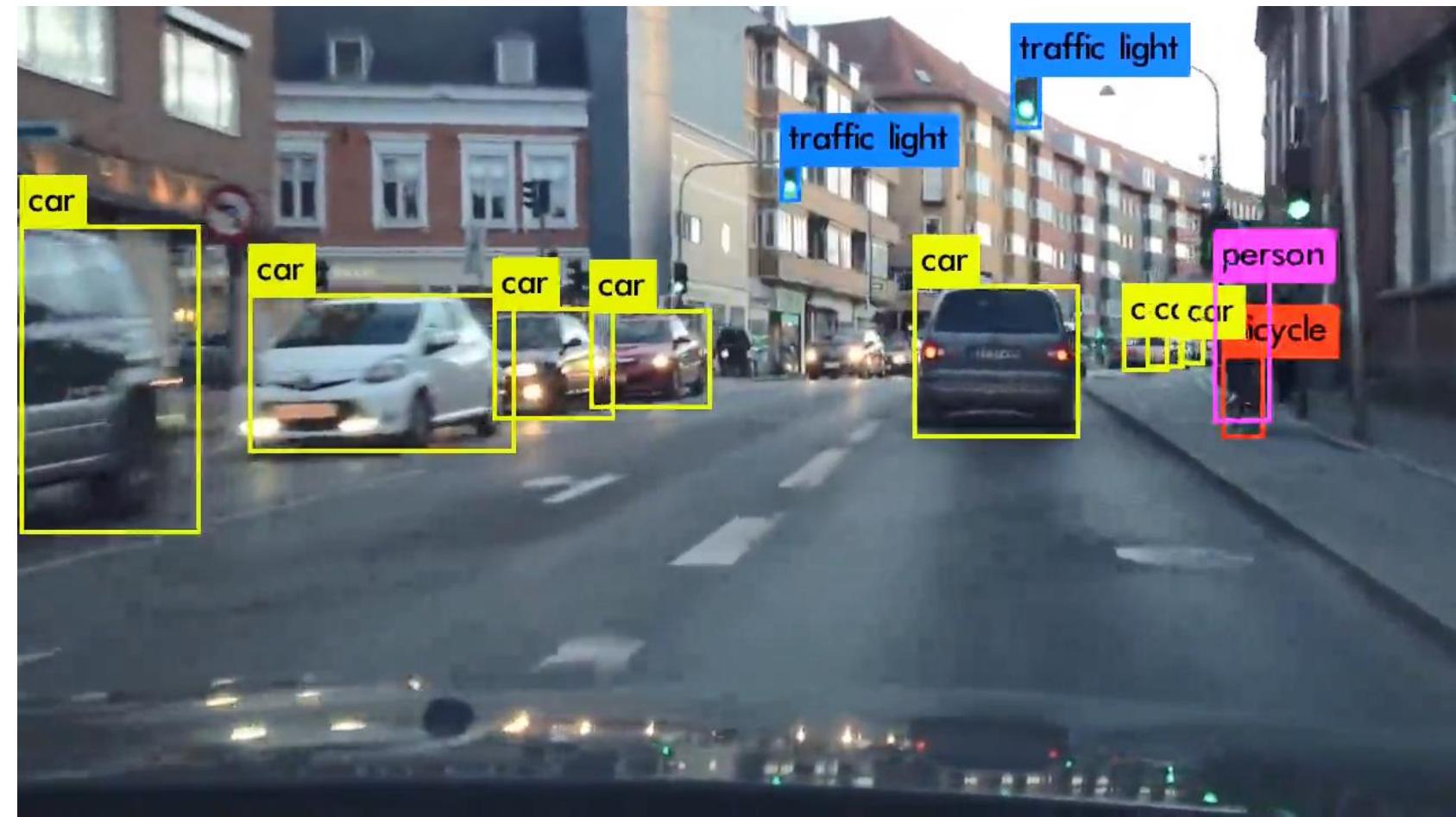
→ "ikke Per"

- Lad netværket iterere
  - Mange** udregninger

# Deep Learning

## Kunstigt neutralt netværk

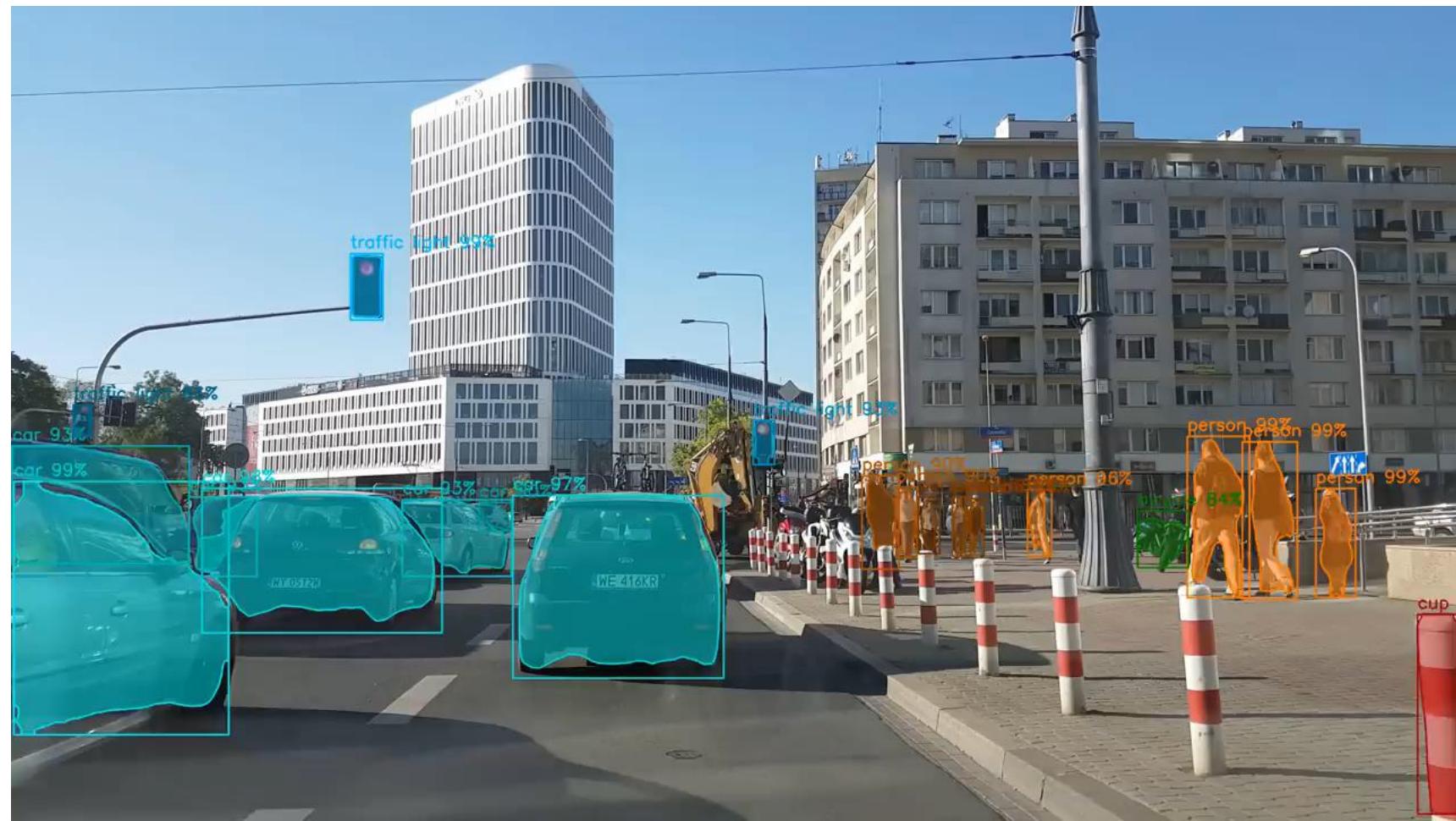
- Imponerende resultater



# Deep Learning

## Kunstigt neuralt netværk

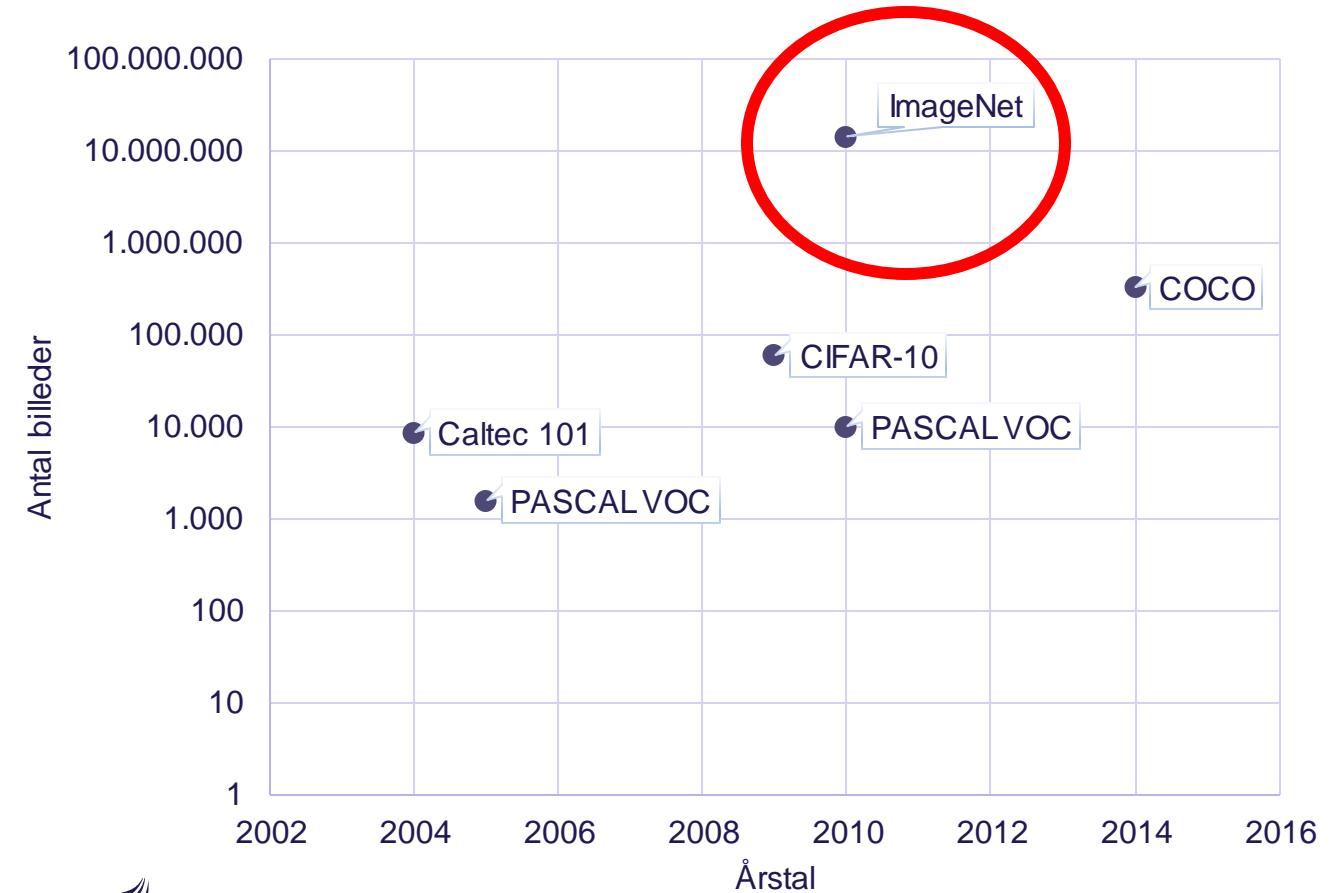
### ► Imponerende resultater



# Deep Learning

## Hvorfor først nu?

- Tilstrekkeligt store datasæt
- Massive mængder af regnekraft

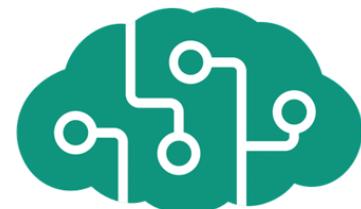


# Hvordan kommer man i gang?

## ► Gør-det-selv



## ► Cloud-baserede tjenester



Microsoft  
Cognitive Services



# Hvordan kommer man i gang?

## ► Cloud-baserede tjenester



Screenshot of the Google Cloud Vision API interface showing the "Labels" tab results for an image of a man in a suit.

The interface includes tabs for Faces, Labels, Web, Properties, Safe Search, and JSON. The Labels tab is active, displaying a list of detected labels with their confidence percentages.

Label	Confidence (%)
Suit	91%
Official	83%
Businessperson	80%
Business	67%
White Collar Worker	67%
Tuxedo	58%
Formal Wear	57%
Management	51%

The image file name "stephen\_nyheden.jpg" is shown at the bottom of the image preview.

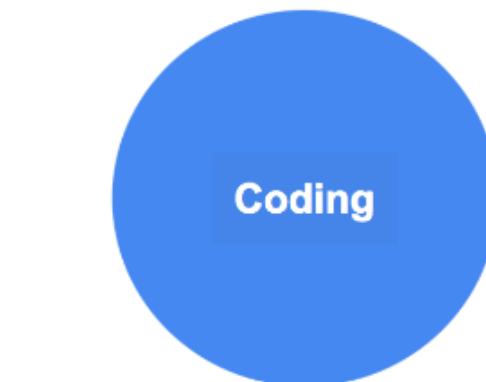
# Hvordan kommer man i gang?

- Kræver træningsdata – jo mere, jo bedre

1 Pre-training: cheap large datasets on related domain



2 Fine-tuning: expensive well-labeled data



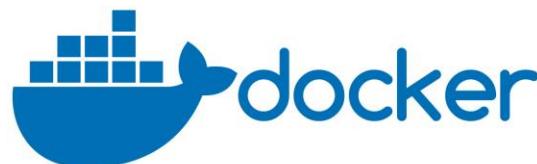
What people think AI is about



The reality

# Hvordan kommer man i gang?

- Gør-det-selv
  - Find Github-repo med kode fra state-of-the-art framework
  - Download docker-billede
  - Finindstil netværket med eget træningsdata
- Generelt
  - Open-source code
  - Lukkede datasæt
  - Lukkede datahåndterings-værktøjer



# Hvordan kommer man i gang?

Populære biblioteker



Keras

PyTorch

Programmeringssprog



Onlinekurser



UDACITY



# Hvad er prisen for en fejl?

- ▶ Et forkert resultat i en Google-søgning?
- ▶ Fejl i ansigtsgenkendelse?
- ▶ En industrikylling, der fejlagtigt bliver klassificeret som rask?
- ▶ Fejldetektion af en person i selvkørende biler?



**ars**TECHNICA

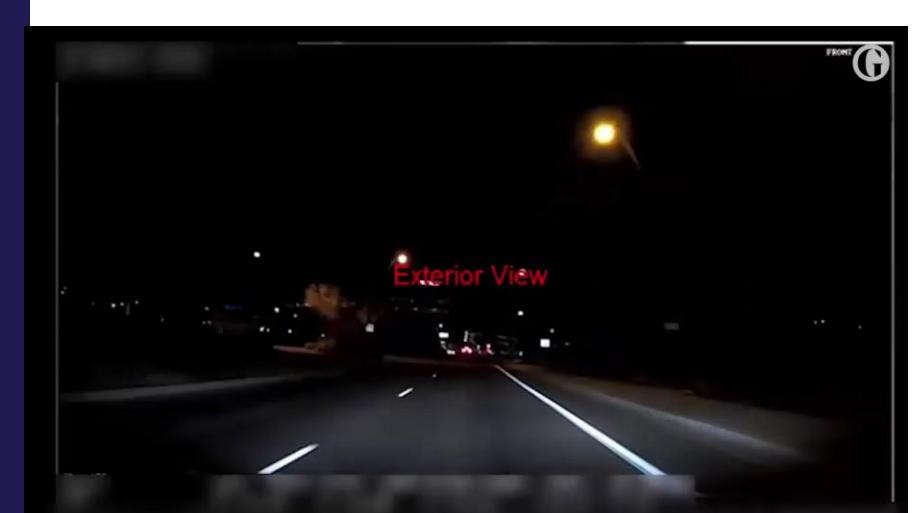
BIZ & IT TECH SCIENCE POLICY CARS GAMING & CULTURE ST

THE FUTURE IS NOT WHAT IT USED TO BE —

## Amazon's Rekognition messes up, matches 28 lawmakers to mugshots

ACLU: "And running the entire test cost us \$12.33—less than a large pizza."

CYRUS FARIVAR - 7/26/2018, 2:00 PM



# Næste emne: Muligheder og begrænsninger i Deep Learning



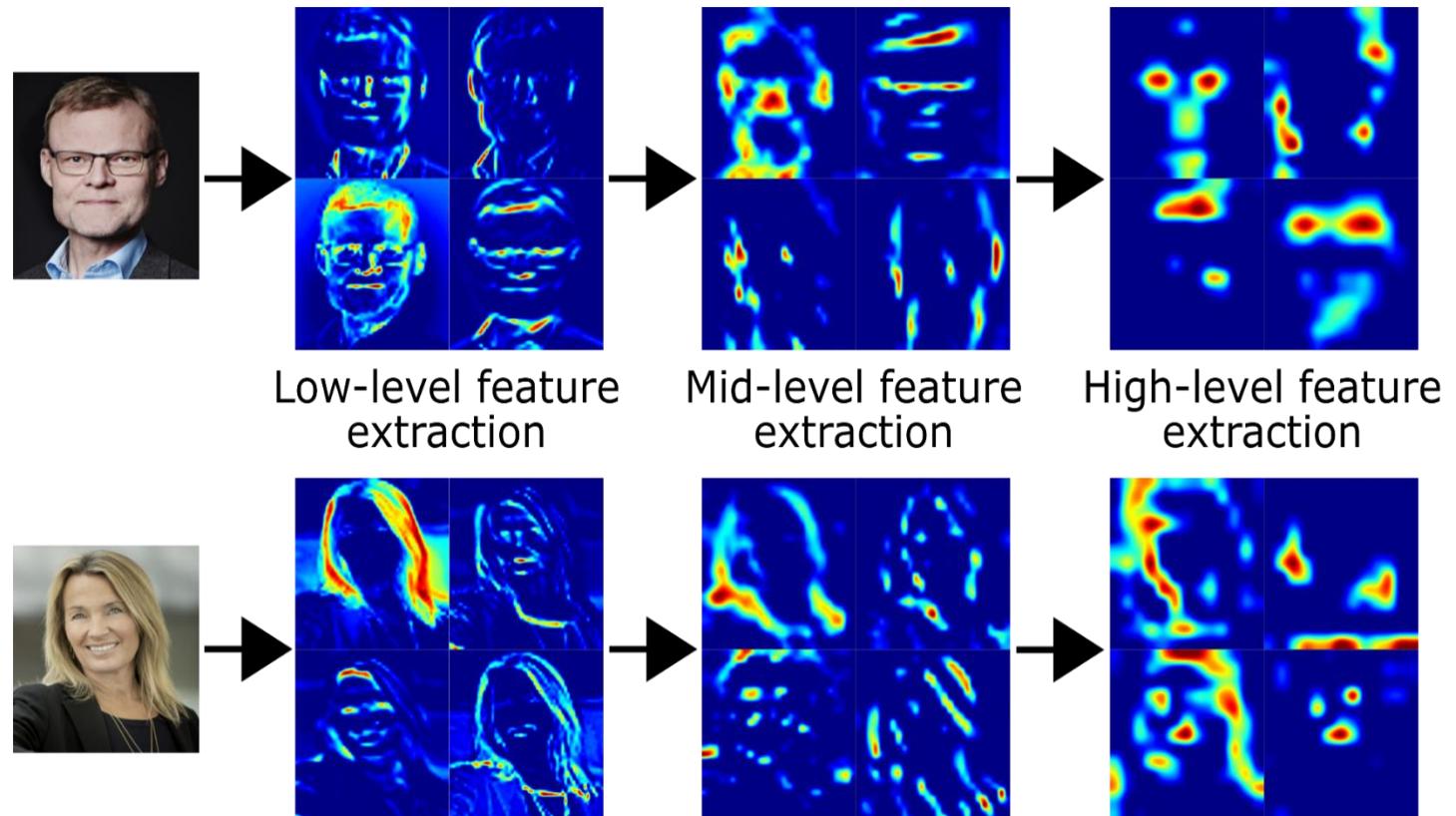


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# AI & the road ahead

The road ahead

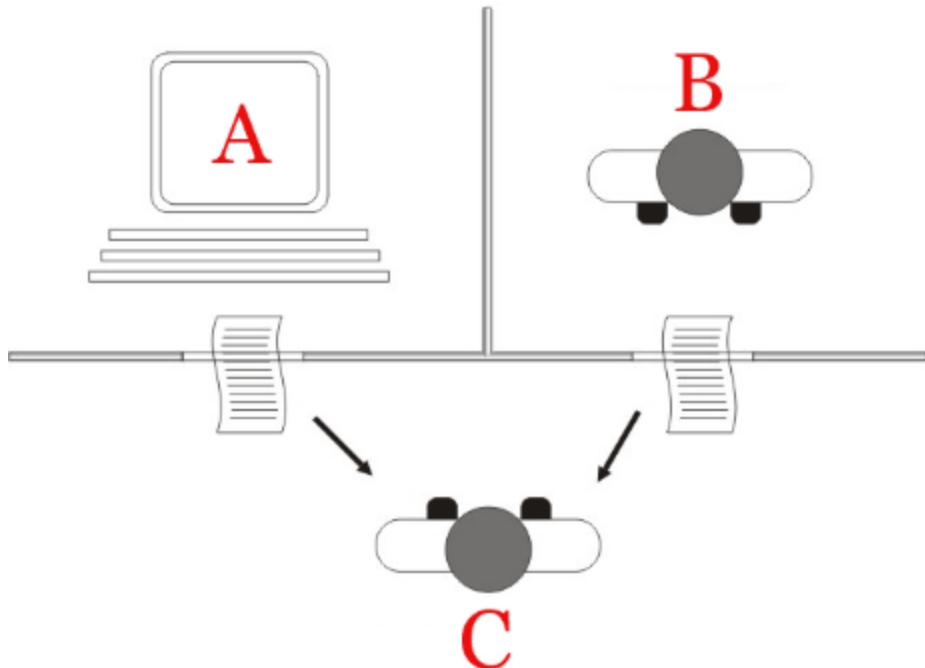
- Thanks for your attention
- Questions?



# Background

Intelligence

- What does "intelligence" mean?
- Is a machine intelligent?
- Alan Turing (1912 - 1954)
- The Turing-Test:

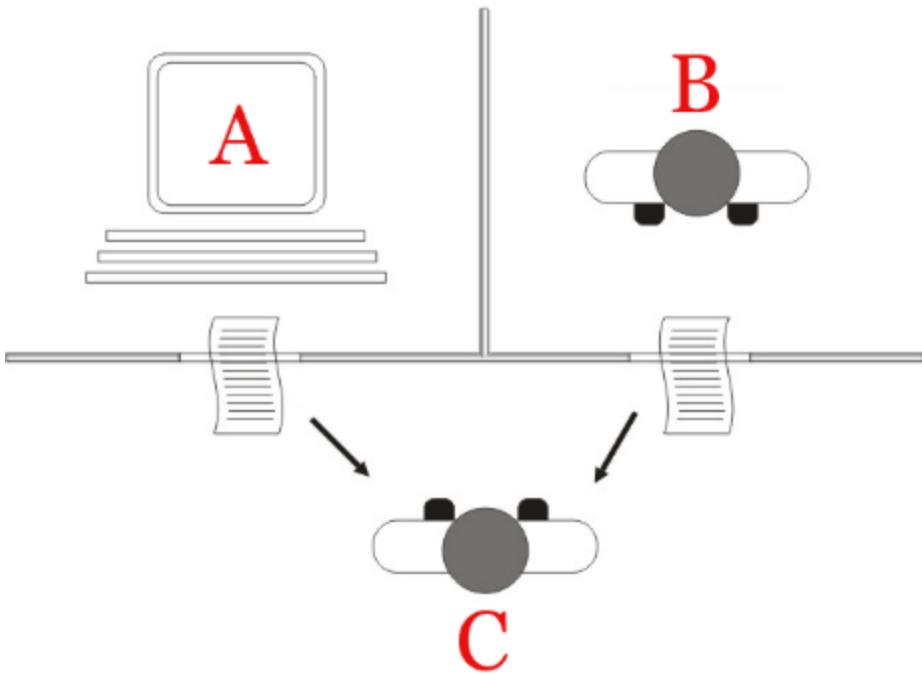


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# Background

Intelligence

- ▶ Earlier:

- ▶ Calculator
- ▶ Thermostats
- ▶ Optical character recognition



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# Background

Intelligence

- ▶ Earlier:

- ▶ Calculator
- ▶ Thermostats
- ▶ Optical character recognition



- ▶ Today:

- ▶ People recognition

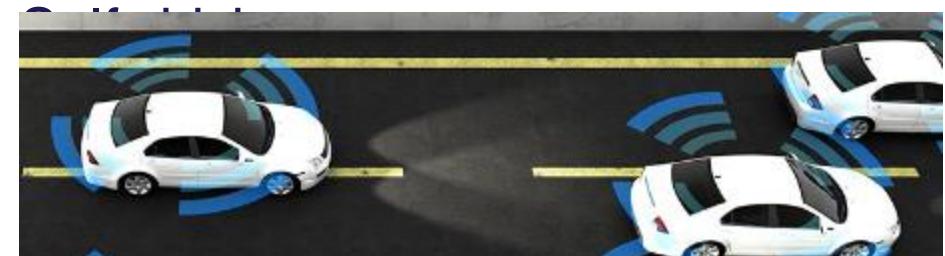
"Lene"



"Per"



- ▶



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# Background

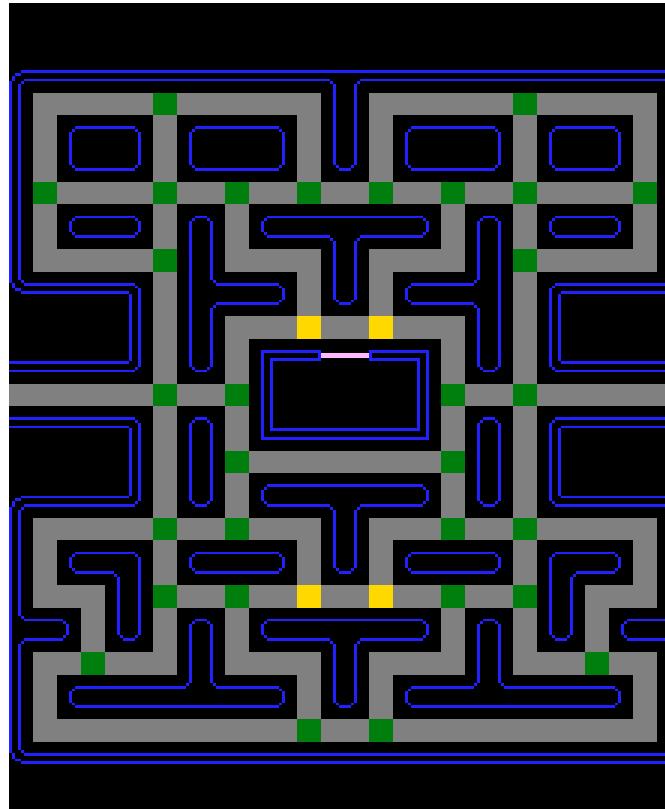
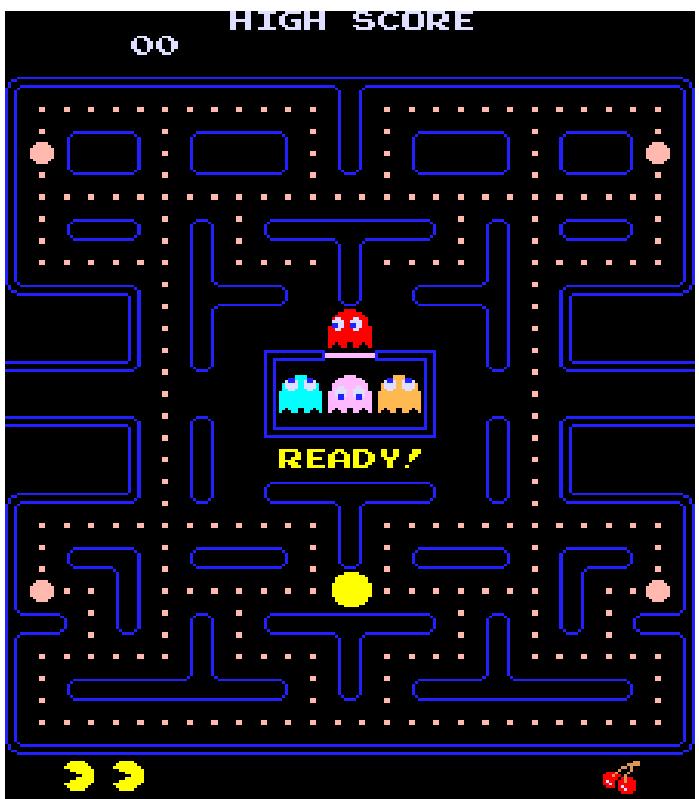
Intelligence

## ➤ Human intelligence vs machine intelligence

	Machine	Human
Hard	 	
Easy		 

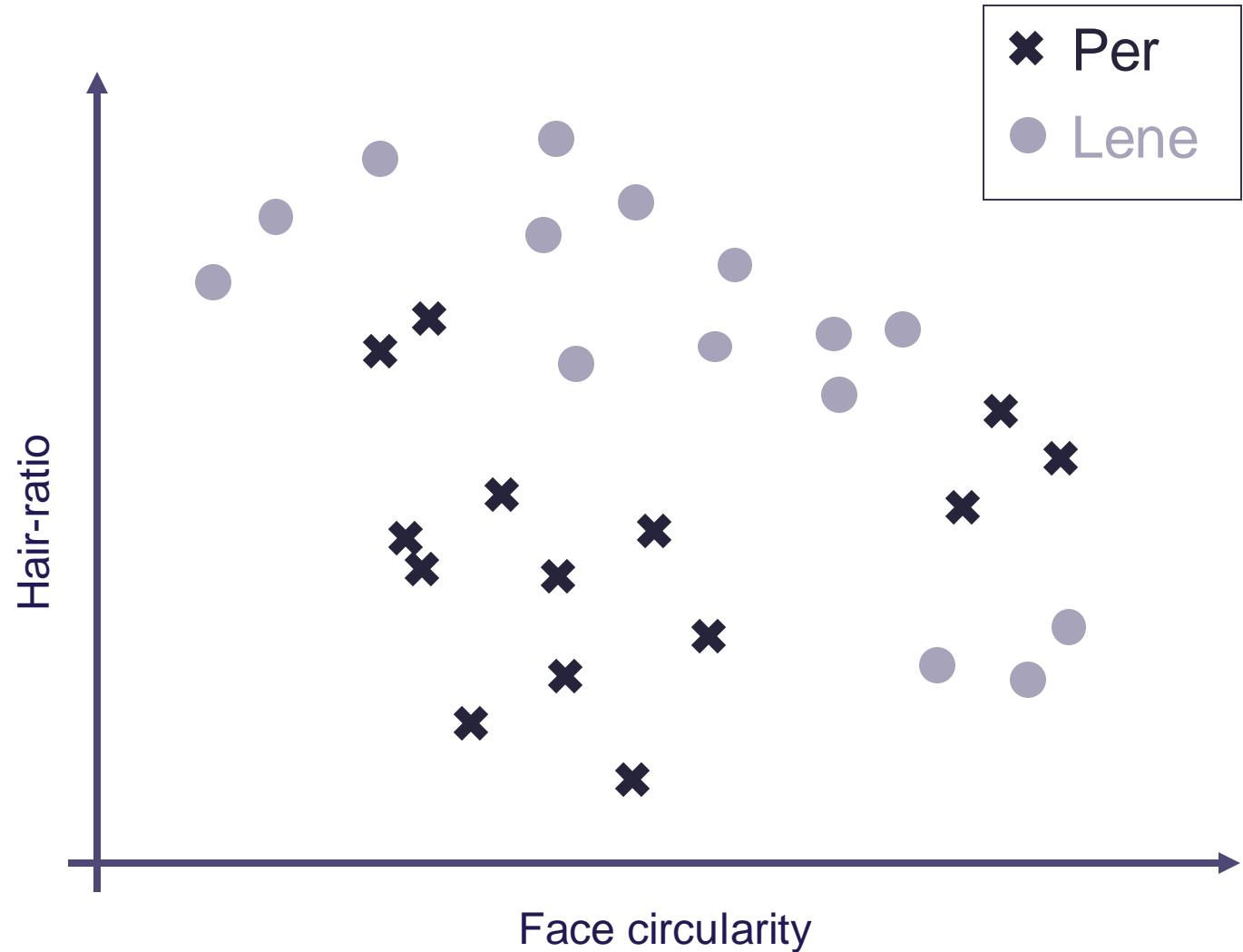
# What is AI?

- AI based on rules



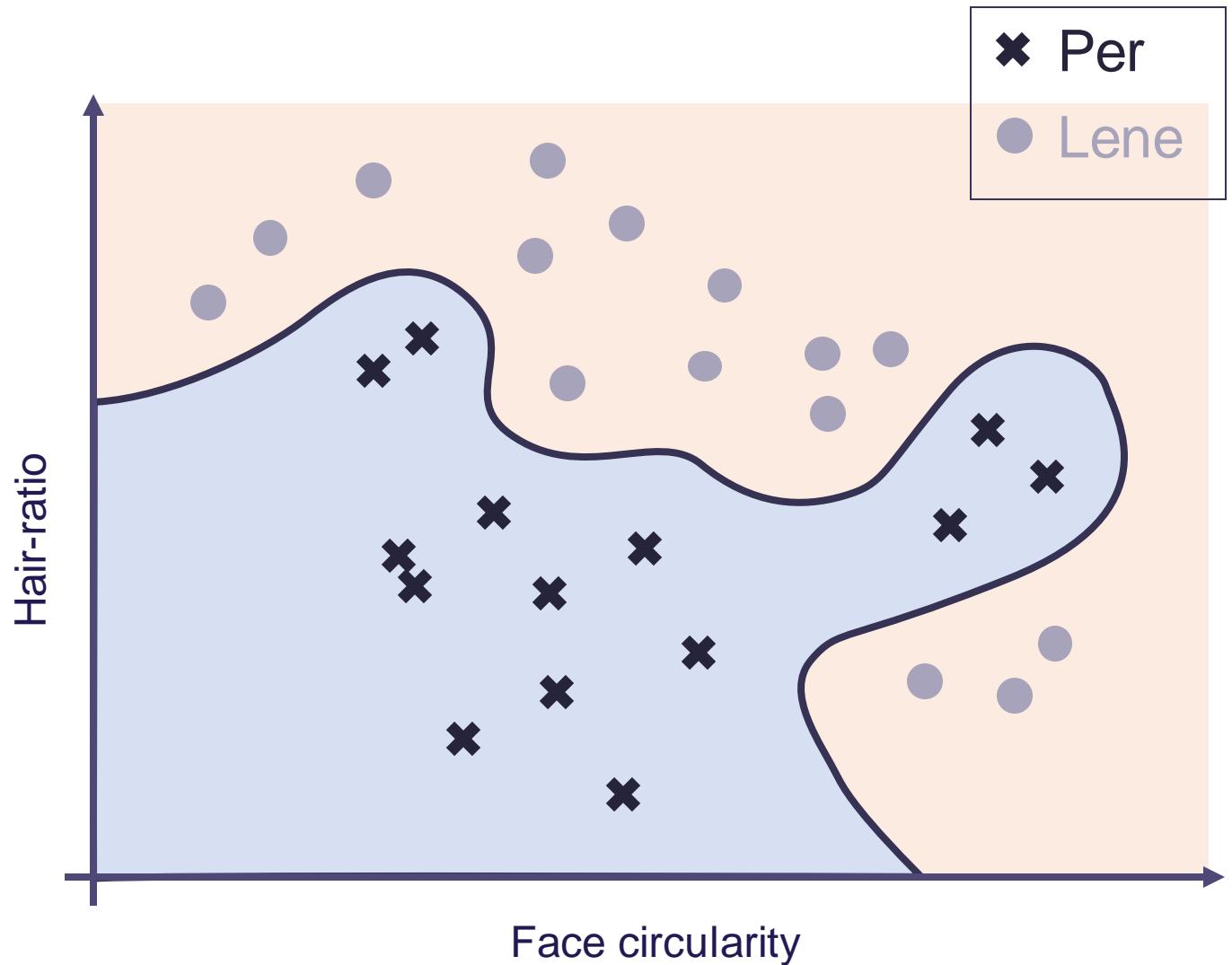
# What is machine learning?

- ⦿ Example: Differentiate between Per and Lene
  - ⦿ Amount of hair?
  - ⦿ Face circularity?
- ⦿ Non-linear?



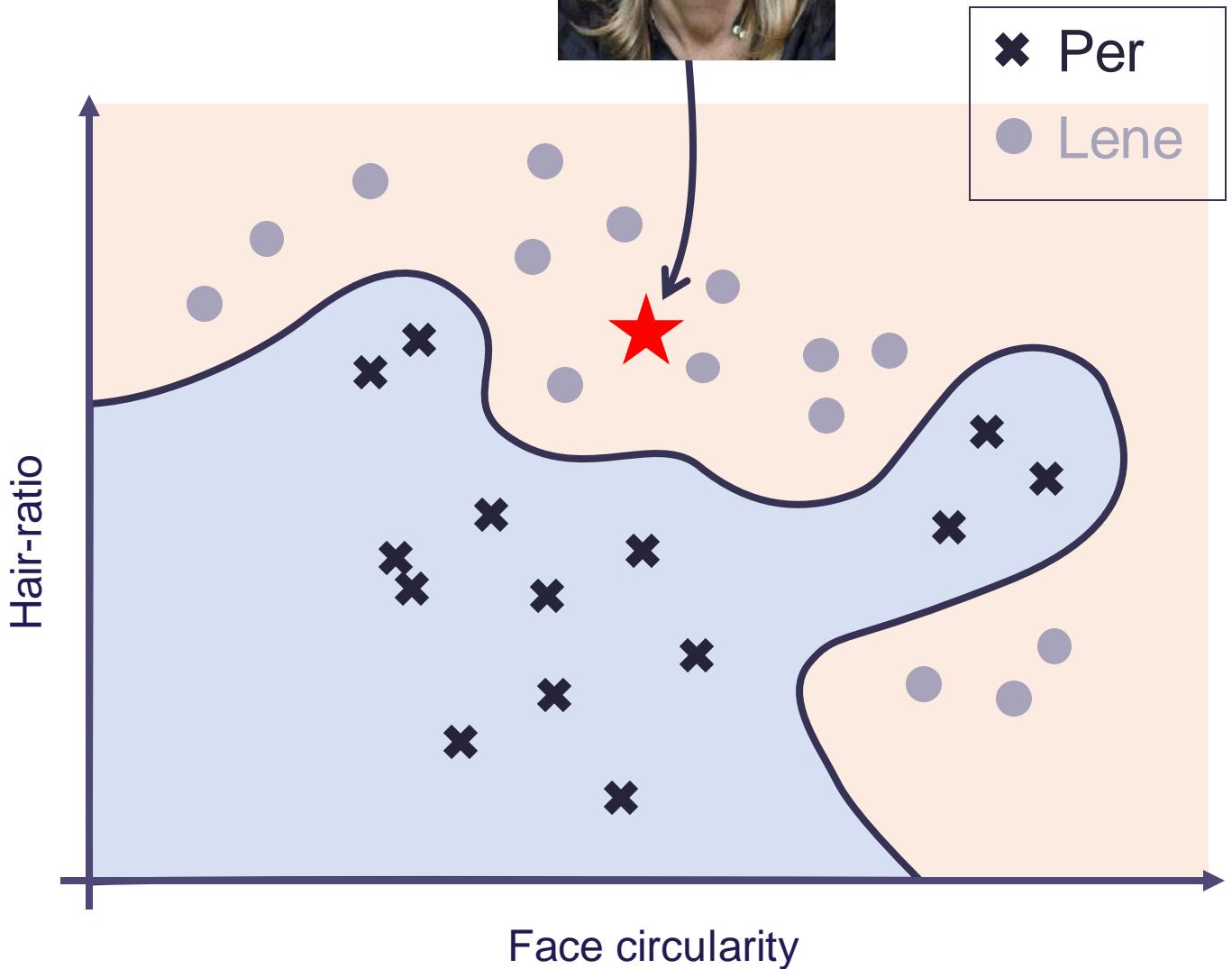
# What is machine learning?

- Example: Differentiate between Per and Lene
  - Amount of hair?
  - Face circularity?
- Find **curve** separating the two categories
  - Non-linear?



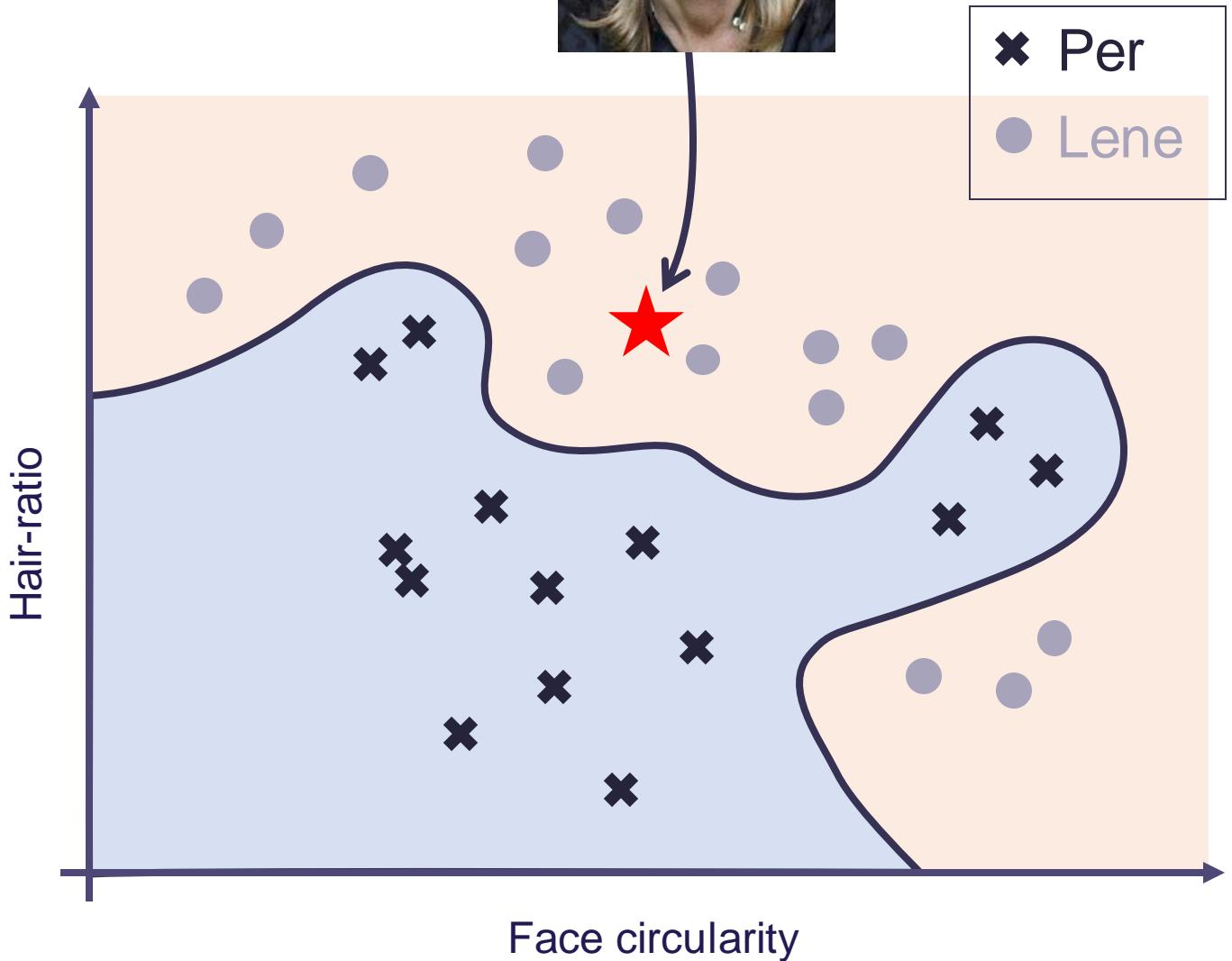
# What is machine learning?

- New image – who?
  - Extract features
  - Where in feature space?
  - Compare to decision line
  - Decide who it is



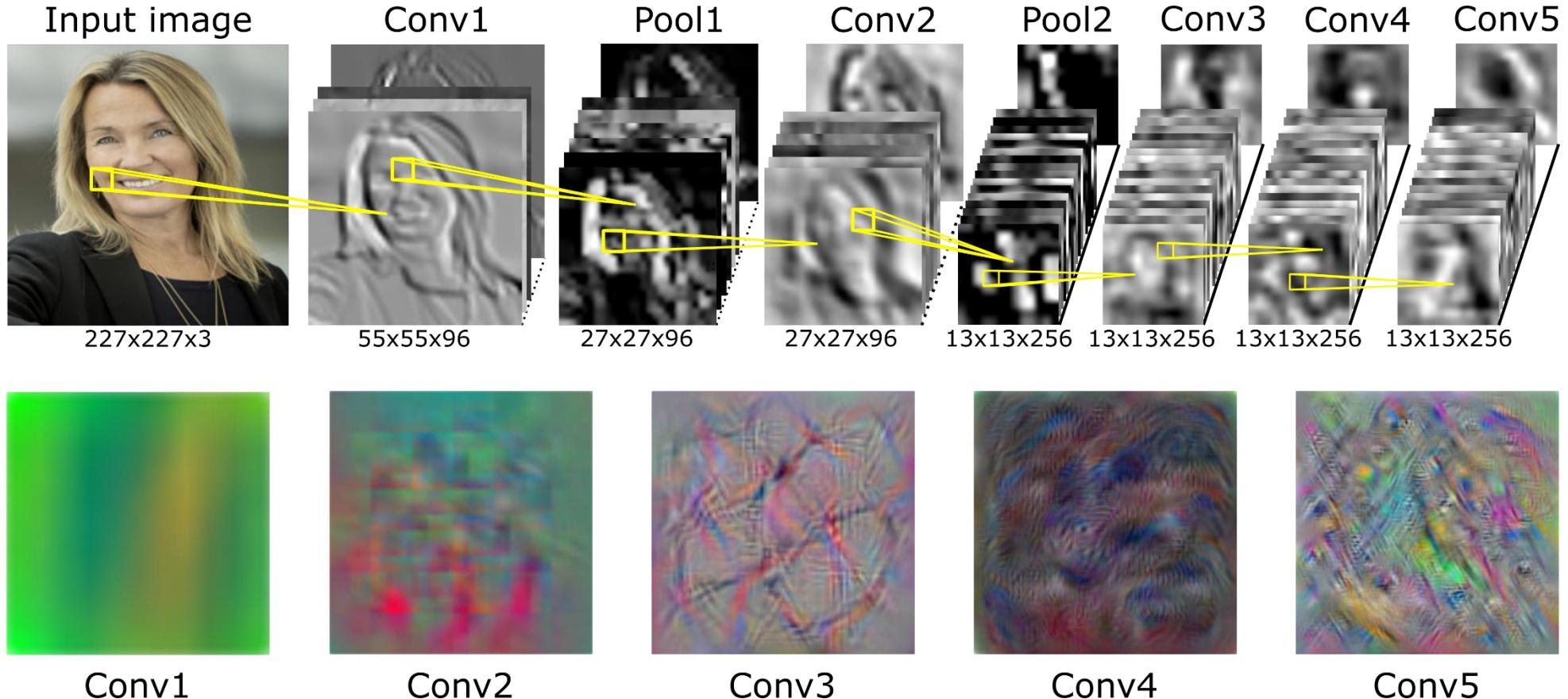
# What is machine learning?

- New image – who?
  - Extract features
  - Where in feature space?
  - Compare to decision line
  - Decide who it is
- This is Machine Learning

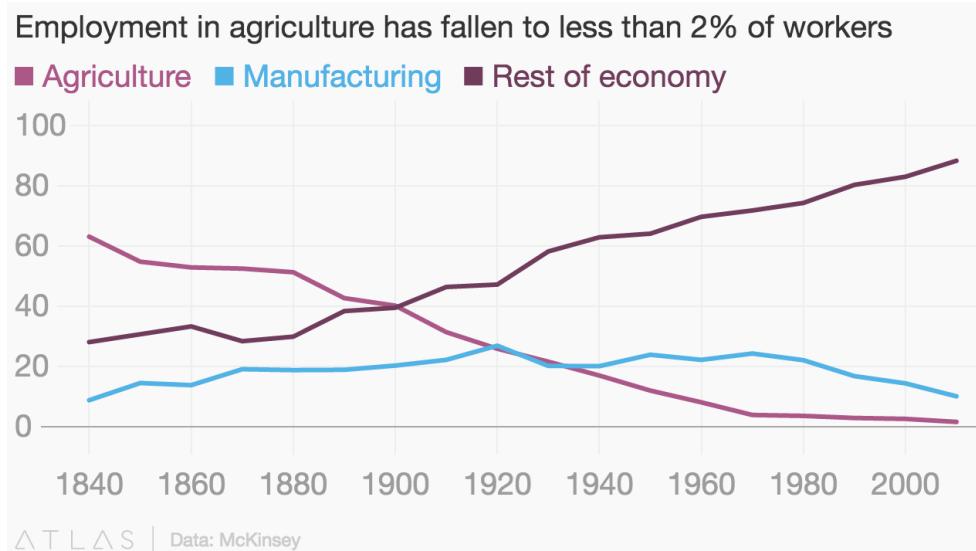


# Deep learning

How does it work?



- >We may look to the past
  - As old jobs are lost to automation, new jobs are created



# of robots in Amazon Warehouses:  
2014: 1.455  
2017: 4.500

