

Deep learning – what it can and cannot do (with emphasize on image exploitation)



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YOLO v2

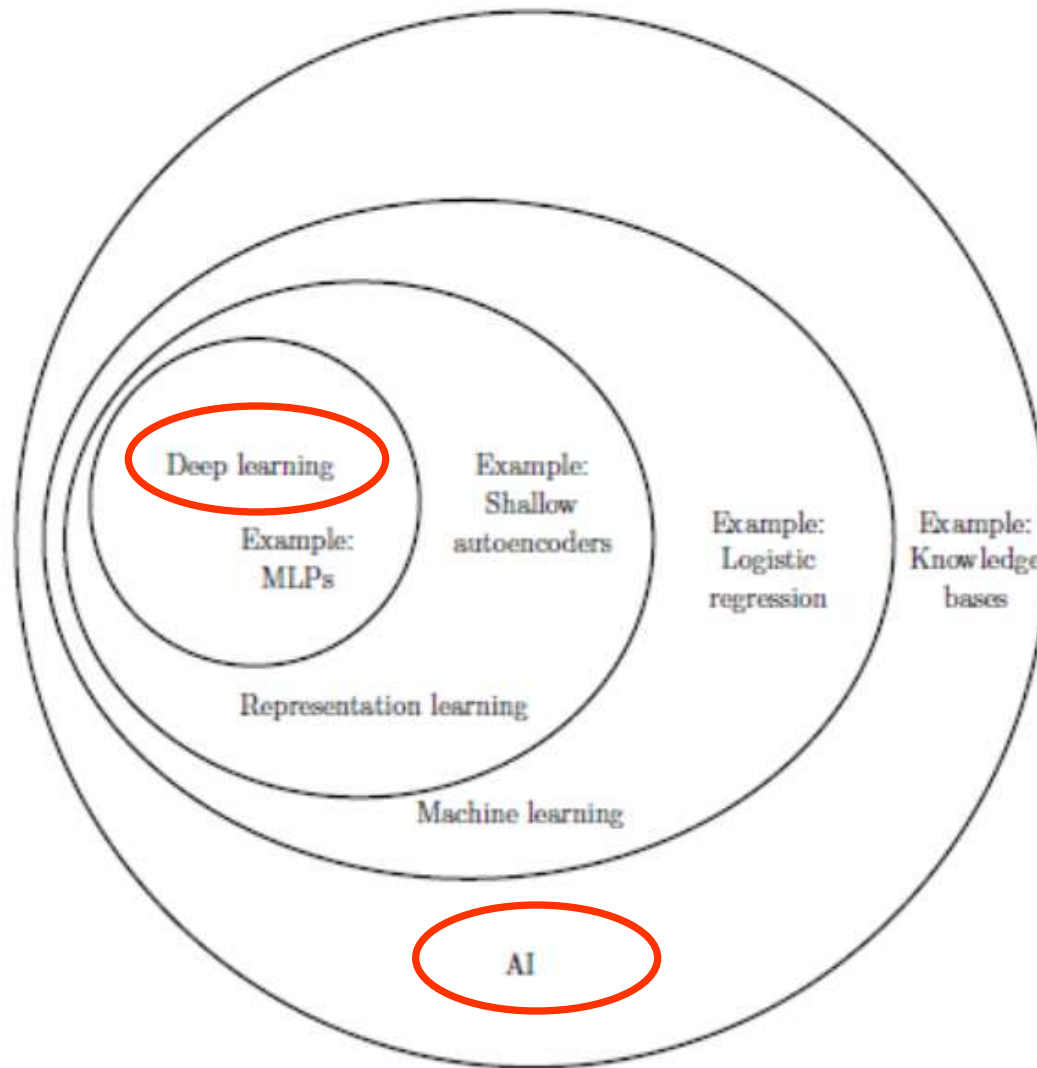
<http://pjreddie.com/yolo>

YOLO: You Only Look Once (version 2) – a Convolutional Neural Network (CNN)

J. Redmon, S. Divvalay, R. Girshick, A. Farhadiy, Uni. Washington, 2016



Deep learning – a part of AI



... for problems which are

- easy for people to perform, but
- difficult to describe formally

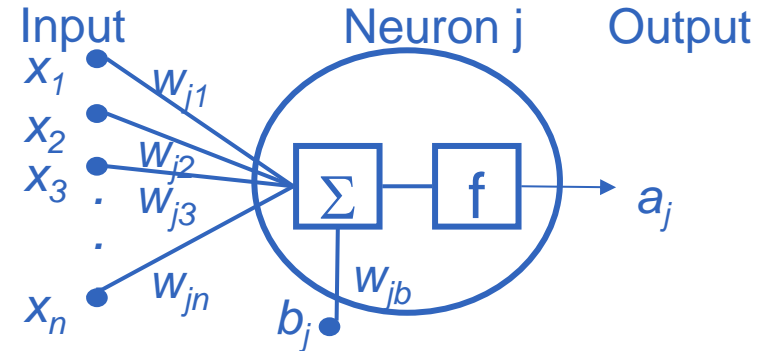
© Goodfellow et al., 2016



Development of deep learning

- Cybernetics („the perceptron“)

- f: a **linear** function
- McCulloch, Pitts, **1943**, Rosenblatt, 1958/62

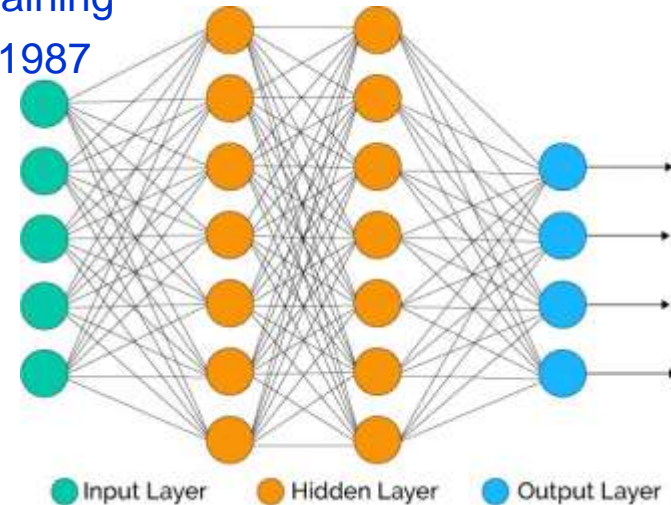


- Connectionism, ANN, MLPs

- f: a **non-linear** function (sigmoid fct., ReLU distributed representation, back propagation for training)
- Rumelhart et al., **1986**, Hinton et al., 1986, LeCun, 1987

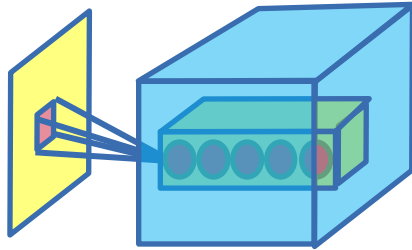
- Deep learning

- **learn representation (features)**
- **learn from actions** (e.g. to write SW)
- faster computers, more training data: efficient training of networks with „many“ layers
- Hinton et al., **2006**
- Krizhevsky et al., 2012: CNN wins ILSVRC, decreasing the error by nearly 50%

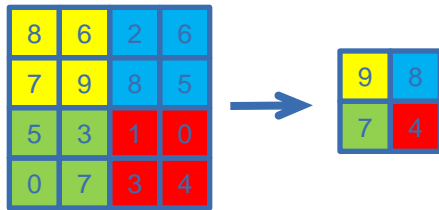


CNN: Convolutional neural networks

- convolution

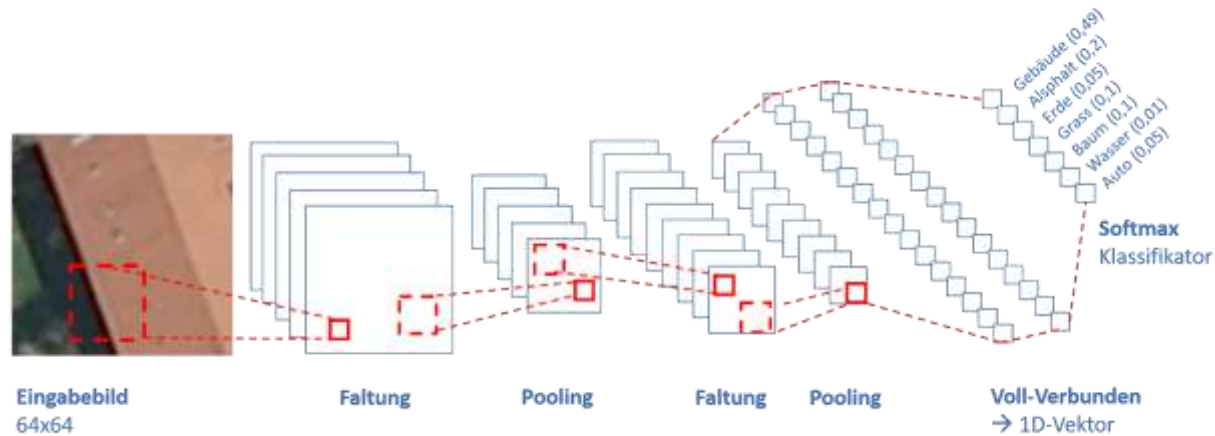
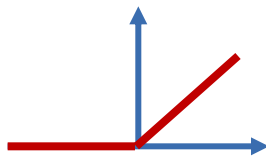


- (max-)pooling



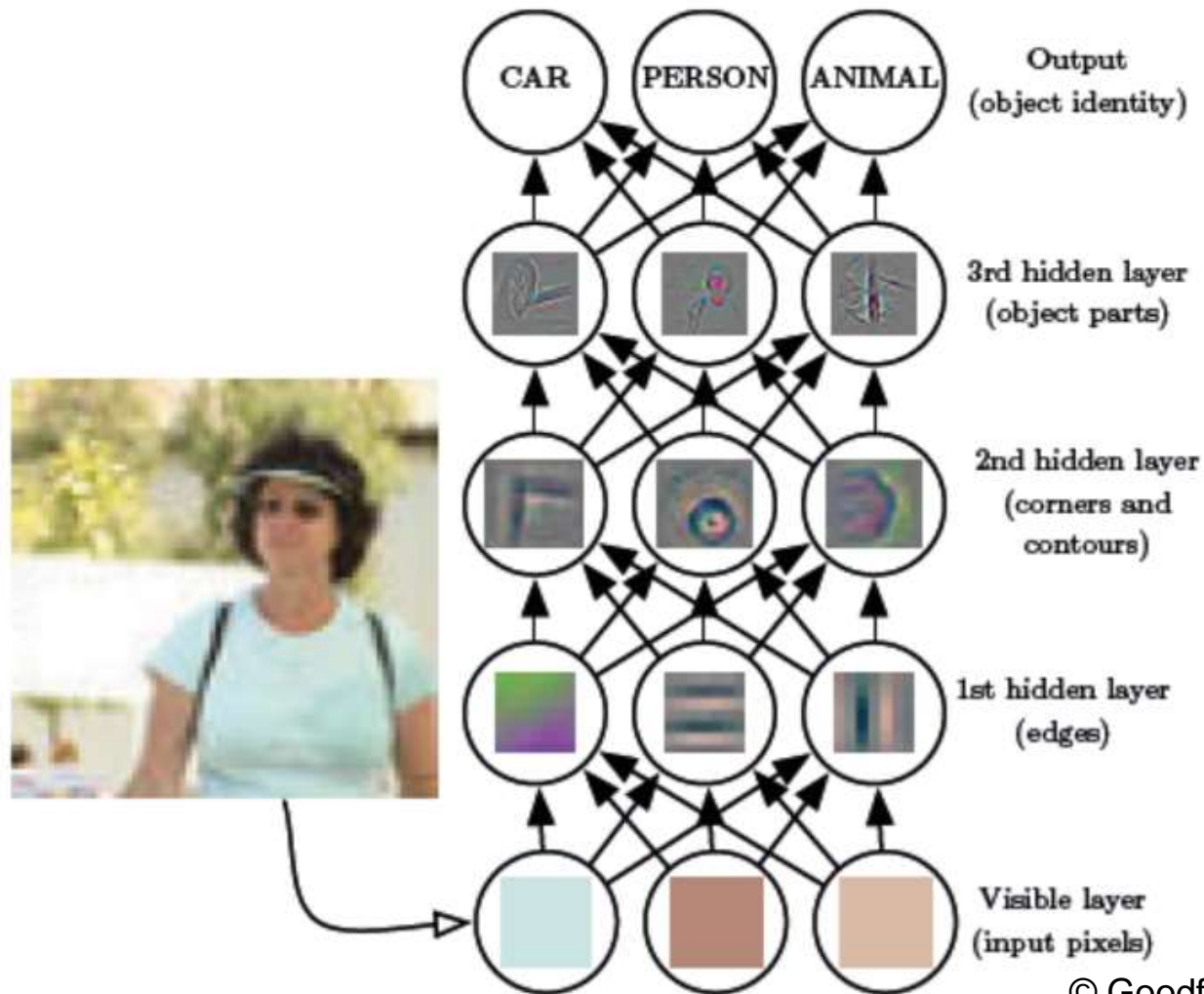
- activation function

e.g. $\text{ReLU}(x) = \max(0, x)$



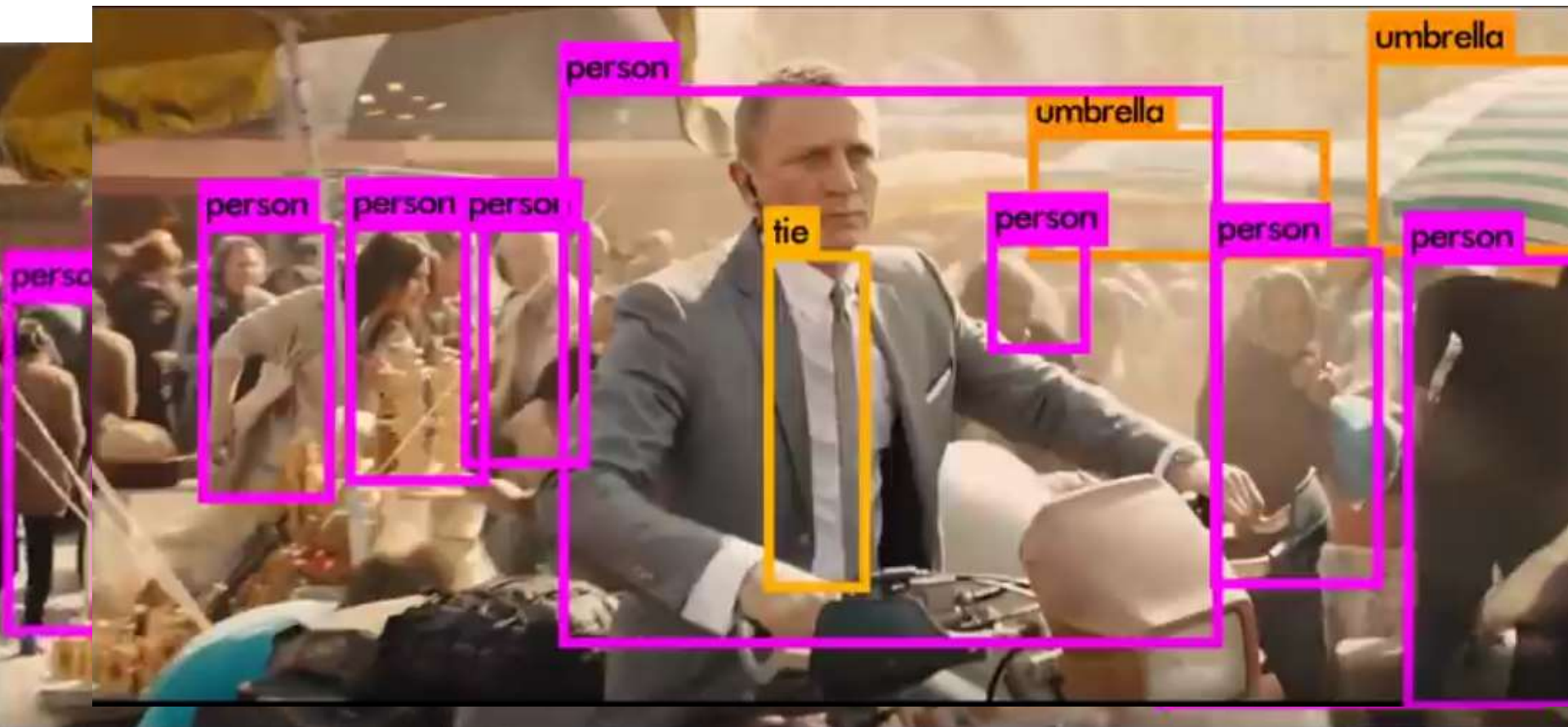
- for regularly structured data
- repeated execution of those steps based on “some “ architecture
- training for parameter learning (millions of filter coefficients)
- classification

CNN: multi-layered, „deep“ networks



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YOLO v2: **Object detection** – state-of-the-art CNN system

% of correctly retrieved items: **70 – 80%** (real-time)

geometric accuracy not assessed





PETS¹ data set: **Object tracking** – ID switches do occur

Precision, robustness and accuracy **lower**



¹ Performance evaluation of tracking and surveillance,
<http://www.cvg.reading.ac.uk/PETS2009/a.html>.

Potential – and limitations

- Very successful applications shown
 - Image and video analysis
 - Text and Language processing, automatic coding, ...
- Limitations
 - unclear how/why deep learning (in part. CNN) performs well
 - many ad hoc parameters (network architecture, ...)
 - little possibility for prediction, no self diagnosis
 - Precision and robustness need improvement for many app's.
 - Extremely large amount of (labelled !) training data needed (pre-trained nets can be used, but reduce adaptability)
- A current hype or a technology to stay?
 - Temporal behaviour, processing of streaming data?
 - Self organisation?



Every picture tells a story ...

