



COMP250: Artificial Intelligence

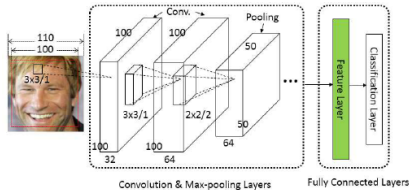
9: Deep Learning

Deep learning

Deep learning

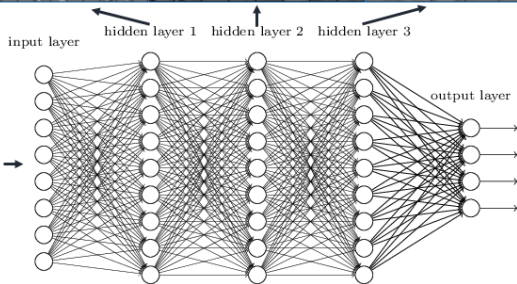
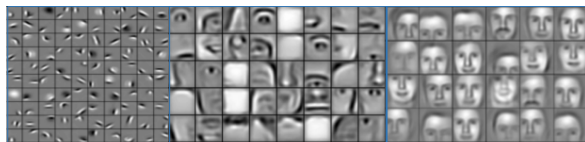
- ▶ Basically, the use of large ANNs with **many layers**
- ▶ Often uses **large training sets**
- ▶ Training often uses powerful **GPUs** — many times faster than training on the CPU

Convolutional Neural Networks (ConvNets)



- Layers are **2D arrays**
- Neurons in convolutional layers are only connected to nearby neurons
- There are also fully connected layers

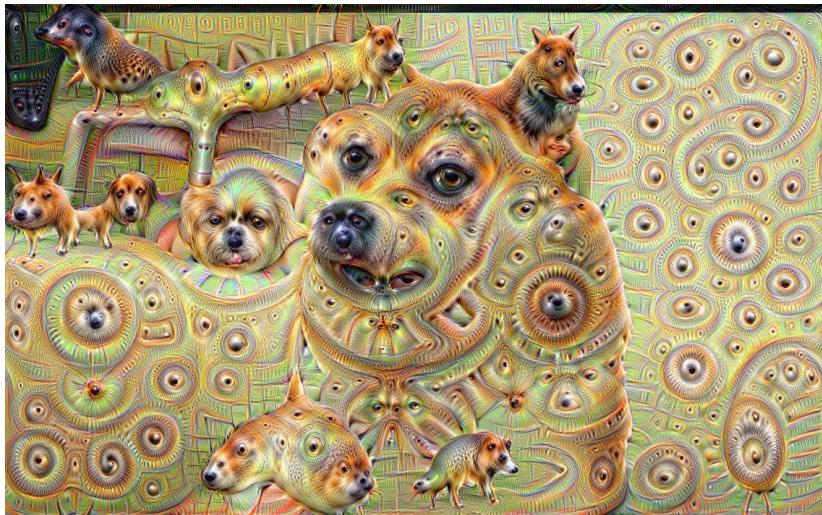
Deep neural networks learn hierarchical feature representations



DeepDream

- ▶ Train a ConvNet to recognise something (e.g. faces, objects, animals)
- ▶ Run the network in “reverse”
 - ▶ Adjust the image (e.g. via gradient ascent) so that it is more strongly recognised by the network

DeepDream



Style transfer

- ▶ Train a ConvNet to recognise a particular artistic style
- ▶ Run the network in “reverse” on an input image
 - ▶ Adjust the image (e.g. via gradient ascent) so that it is more strongly recognised by the network

Style transfer



Source image (**Style**)



Target image (**Content**)



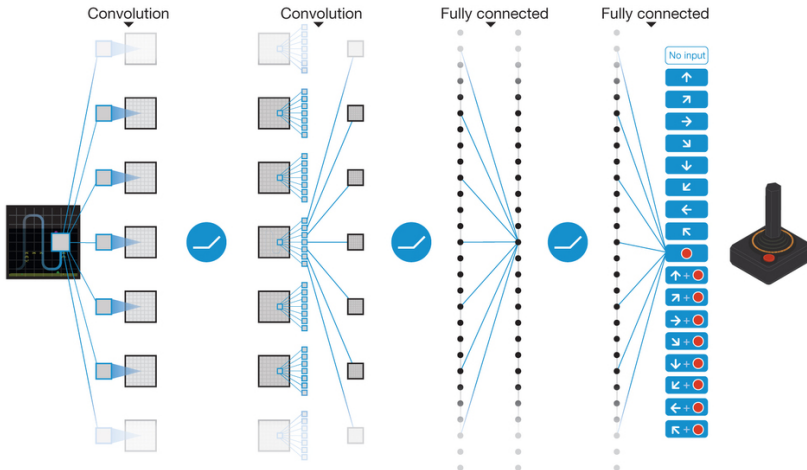
Output ([deepart](#))

A Neural Algorithm of Artistic Style [[Gatys et al. 2015](#)]

Generative Adversarial Networks (GANs)

- ▶ Two ANNs trained in parallel
 - ▶ One to generate “fake” artefacts
 - ▶ One to distinguish “real” from “fake”
- ▶ http://research.nvidia.com/publication/2017-10_Progressive-Growing-of

Learning to play Atari games (Mnih et al, 2015)



AlphaGo (Silver et al, 2017)

- ▶ MCTS with ANNs for move pruning, simulation playouts and state evaluation
- ▶ ANNs trained on both expert human matches and self-play (reinforcement learning)
- ▶ Defeated Lee Sedol, world Go champion

AlphaZero (Silver et al, 2018)

- ▶ Similar MCTS+ANN architecture to AlphaGo
- ▶ Trained by reinforcement learning (self-play) only
- ▶ After only 9 hours* of training, defeated Stockfish (one of the strongest chess programs available) in a 100-match tournament
 - ▶ * On a cluster of 5000 of Google's custom Tensor Processing Units
- ▶ Stockfish is based on decades of research by expert chess players and AI programmers — AlphaZero started from no chess-specific knowledge whatsoever (other than the rules of the game)

Deep learning for PCG

<https://www.youtube.com/watch?v=3wcpLwvBTYo>