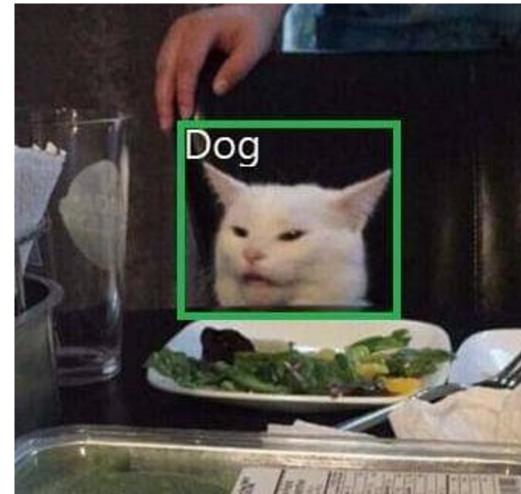
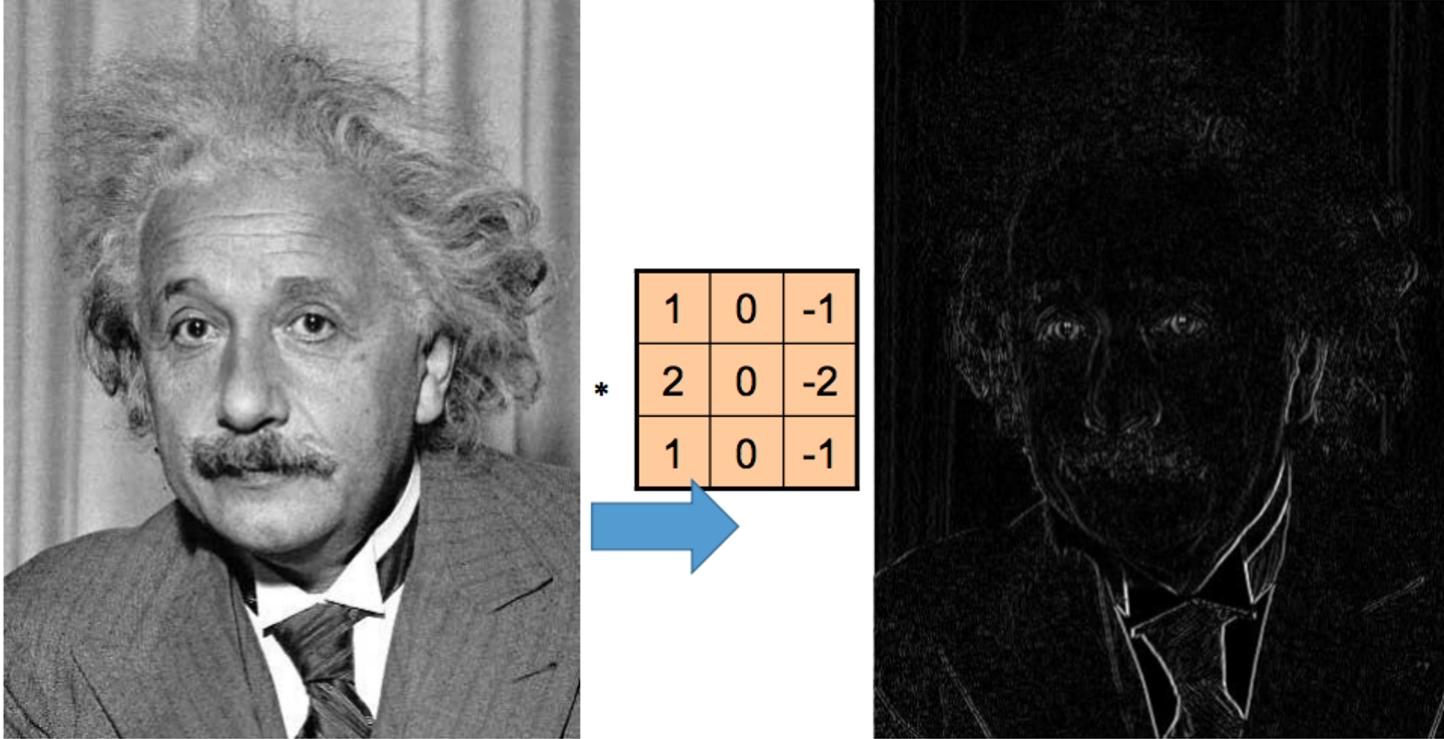


# Seminar 3: CNN

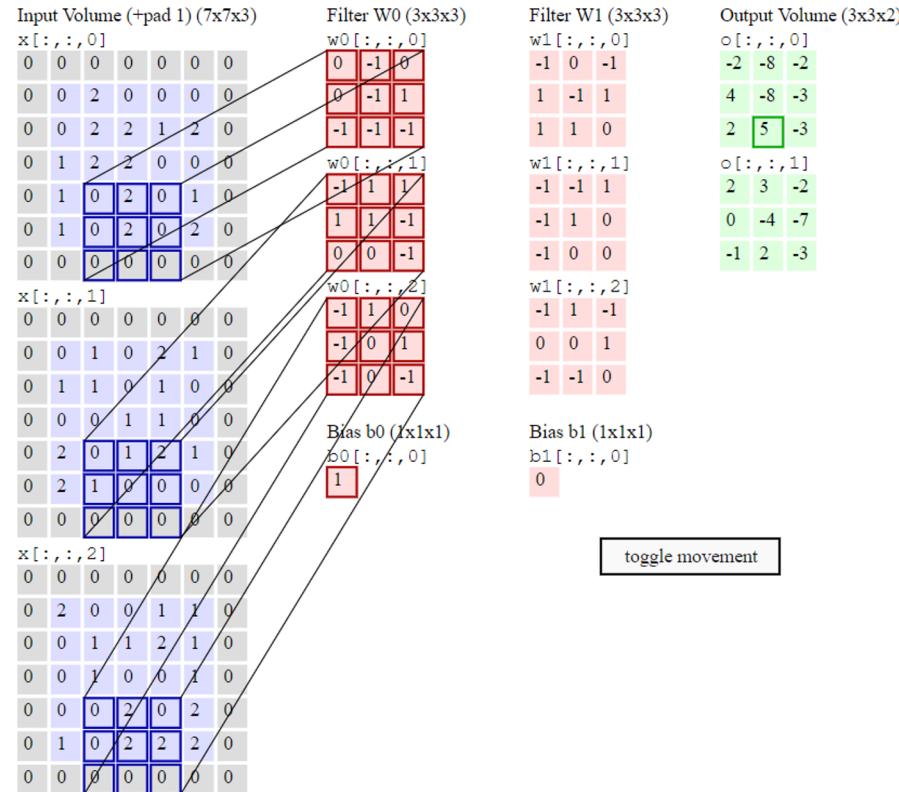


# Filters is CV



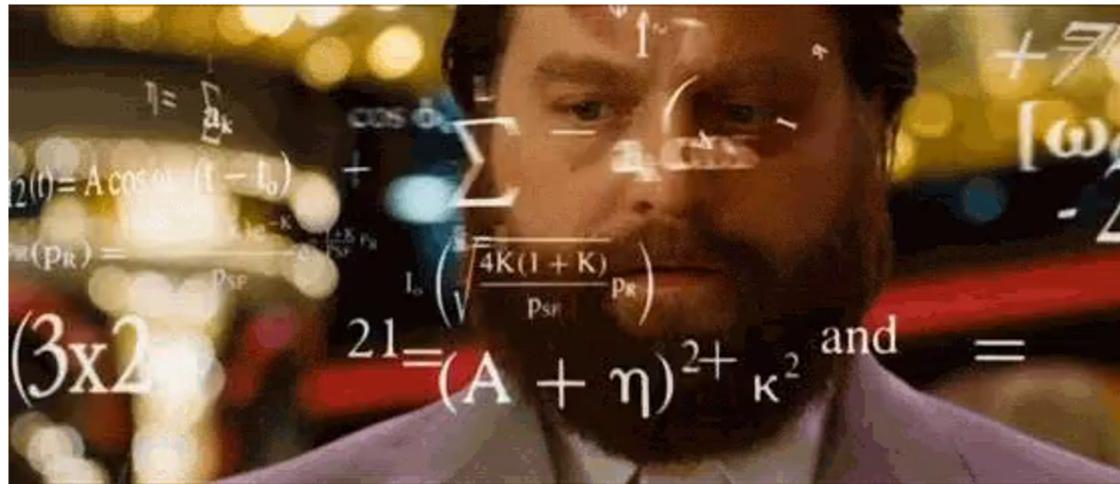
Vertical Edge  
(absolute value)<sup>7</sup>

# Convolution Layer



# Why conv nets is better than fc?

# Got it? Let's calculate parameters!



# More convolutions!

$$\begin{bmatrix} 3 & 6 & 9 \\ 4 & 8 & 12 \\ 5 & 10 & 15 \end{bmatrix} = \begin{bmatrix} 3 \\ 4 \\ 5 \end{bmatrix} \times [1 \ 2 \ 3]$$

Image 1: Separating a 3x3 kernel spatially

Spatial Separable Convolutions =

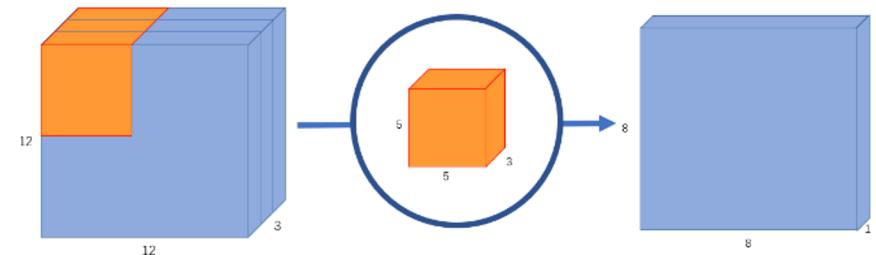


Image 4: A normal convolution with 8x8x1 output

Depthwise Separable Convolutions =

depthwise convolution + pointwise convolution

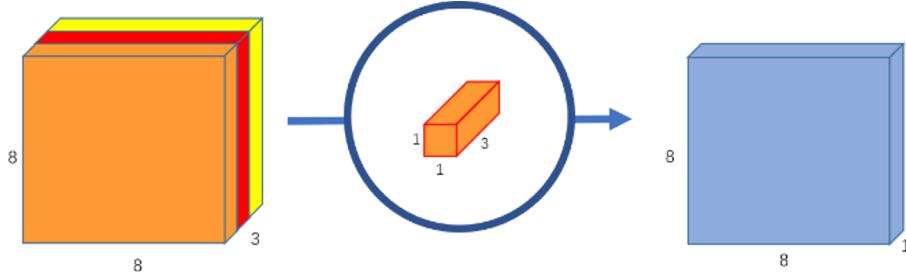


Image 7: Pointwise convolution, transforms an image of 3 channels to an image of 1 channel

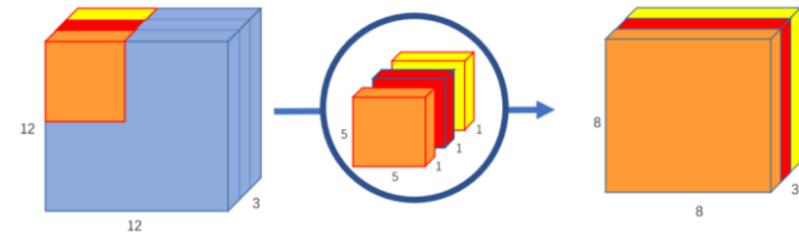
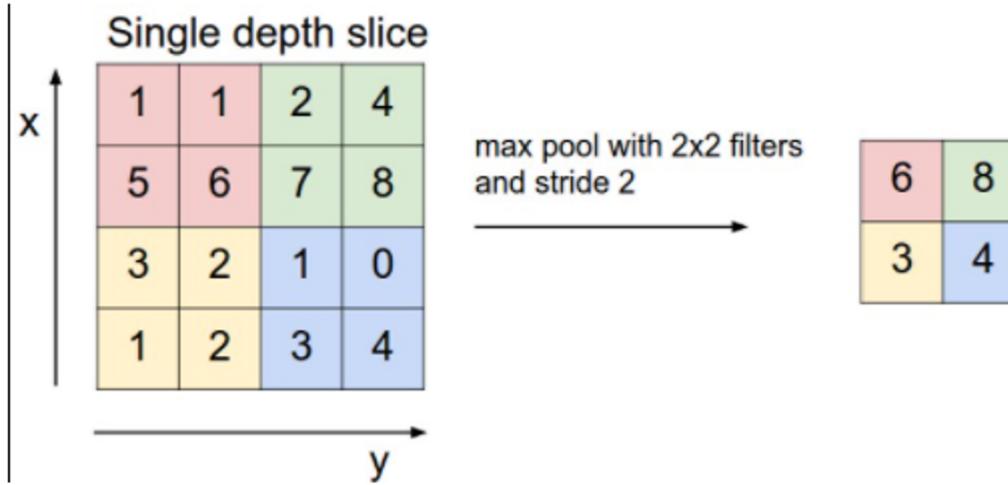


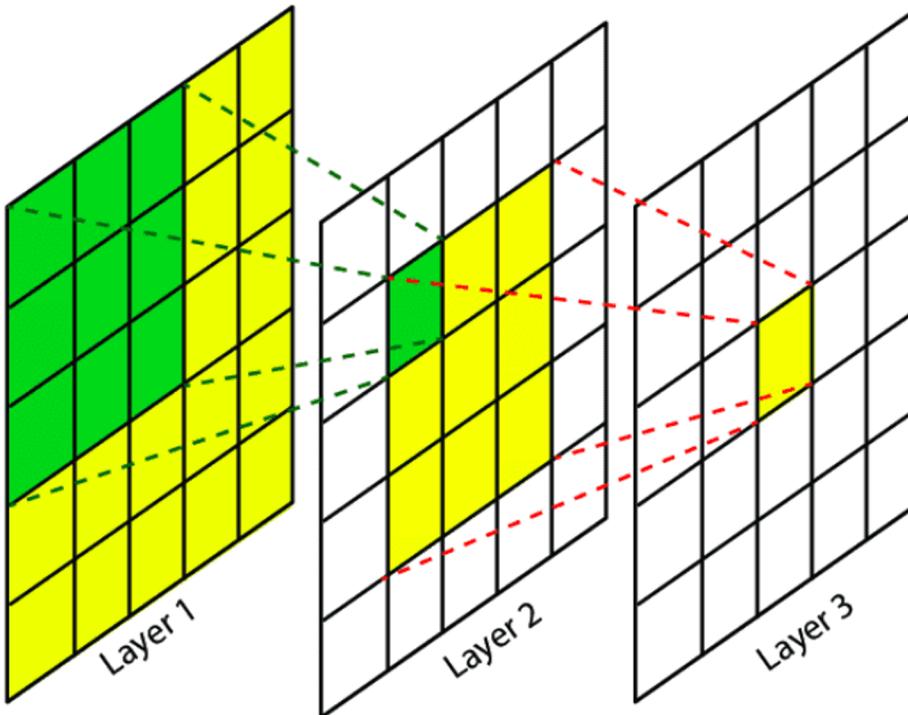
Image 6: Depthwise convolution, uses 3 kernels to transform a 12x12x3 image to a 8x8x3 image

# Max Pooling

*“The pooling operation used in convolutional neural networks is a big mistake and the fact that it works so well is a disaster.”*



# Idea of receptive field



more info: <https://theaisummer.com/receptive-field/>

# Invariance

Translation Invariance



Rotation/Viewpoint Invariance



Size Invariance

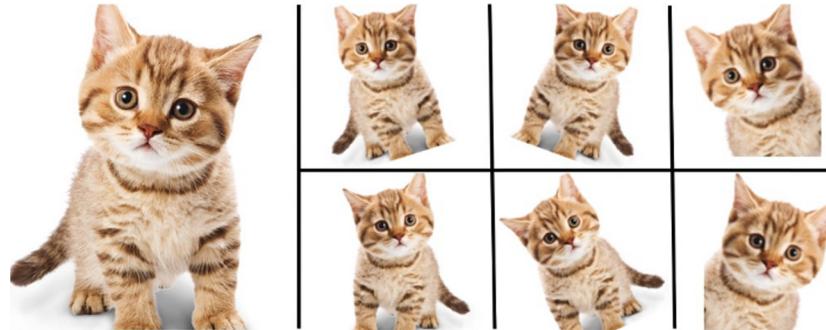


Illumination Invariance



<https://stats.stackexchange.com/questions/208936/what-is-translation-invariance-in-computer-vision-and-convolutional-neural-netwo>

# Augmentation



Enlarge your Dataset



Flipping



Colour Jittering



Rotating



Edge Enhancement



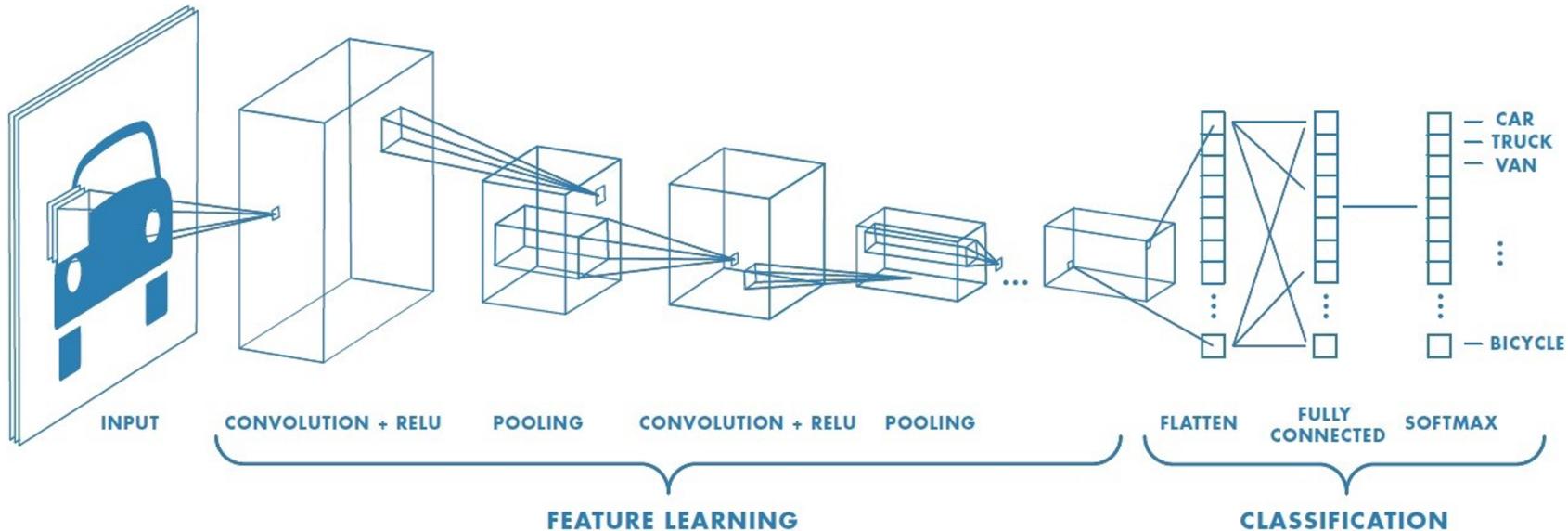
Cropping



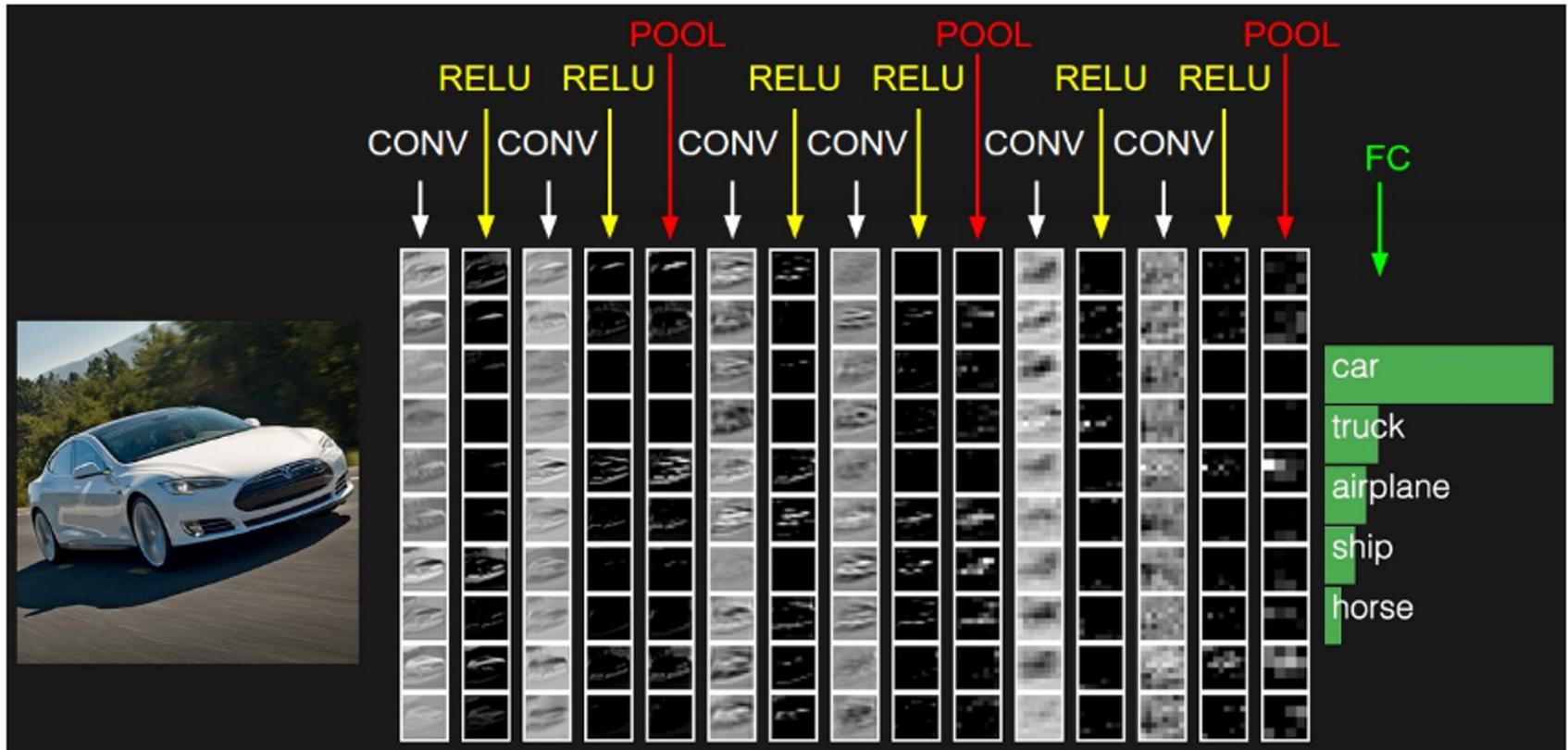
Fancy PCA

Original

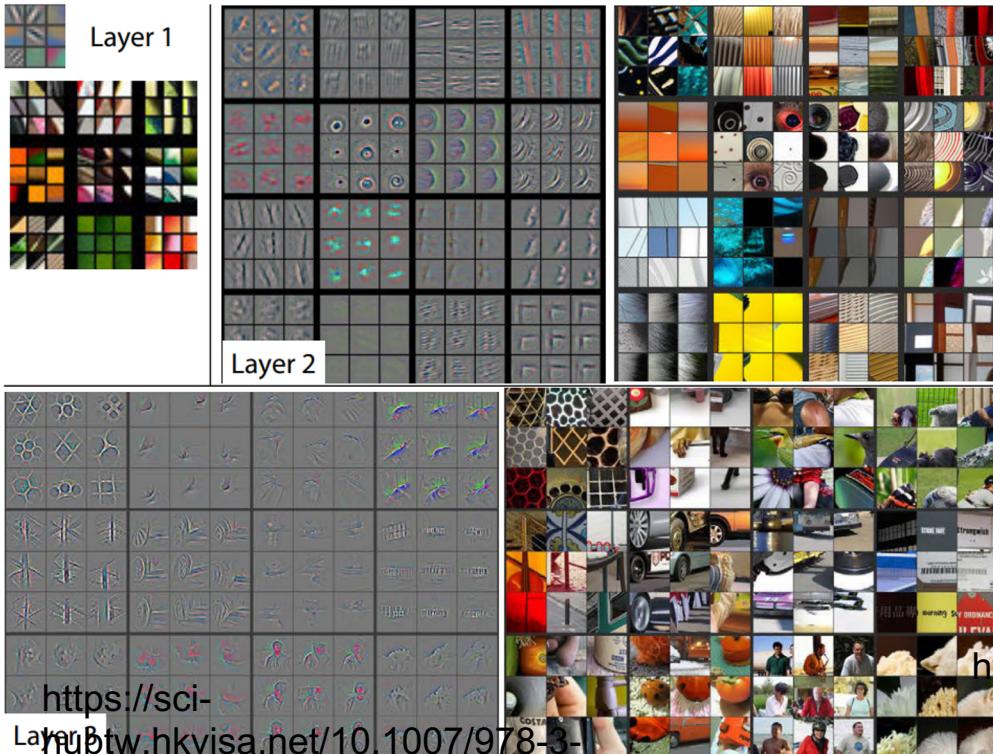
# Convolutional NN



# Convolutional NN



# What CNN actually learn?



**Dataset Examples** show us what neurons respond to in practice



<https://distill.pub/2017/feature-visualization/>

[https://science-hub.tw.hkvisa.net/10.11007/978-3-319-10590-1\\_53](https://science-hub.tw.hkvisa.net/10.11007/978-3-319-10590-1_53)