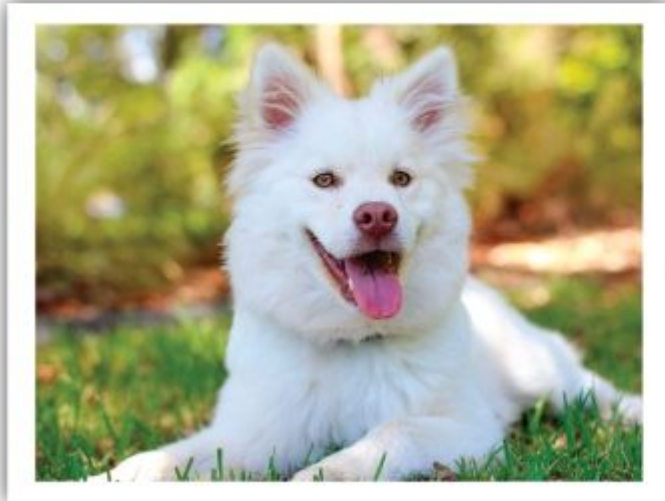




# Module 4



# Computer Vision - Working with Images



Model

Dog

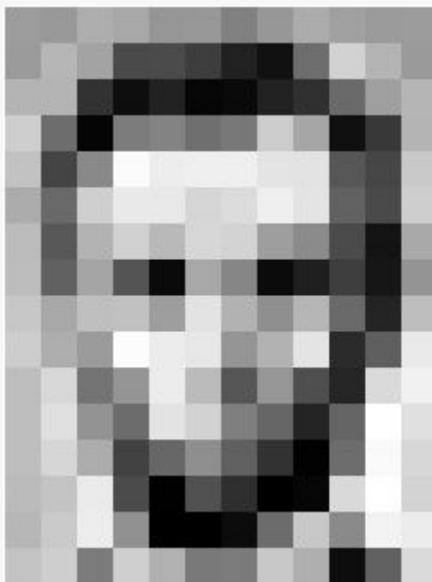
0.98

Cat

0.02



# Working with images



157	153	174	168	150	152	129	151	172	161	155	156
155	182	163	74	75	62	33	17	110	210	180	154
180	180	50	14	34	6	10	33	48	105	159	181
206	109	5	124	131	111	120	204	166	15	56	180
194	68	137	251	237	239	239	228	227	87	71	201
172	105	207	233	233	214	220	239	228	98	74	206
188	88	179	209	185	215	211	158	139	75	20	169
189	97	165	84	10	168	134	11	31	62	22	148
199	168	191	193	158	227	178	143	182	106	36	190
205	174	155	252	236	231	149	178	228	43	95	234
190	216	116	149	236	187	85	150	79	38	218	241
190	224	147	108	227	210	127	102	36	101	255	224
190	214	173	66	103	143	95	50	2	109	249	215
187	196	235	75	1	81	47	0	6	217	255	211
183	202	237	145	0	0	12	108	200	138	243	236
195	206	123	207	177	121	123	200	175	13	96	218

157	153	174	168	150	152	129	151	172	161	155	156
155	182	163	74	75	62	33	17	110	210	180	154
180	180	50	14	34	6	10	33	48	106	159	181
206	109	5	124	131	111	120	204	166	15	56	180
194	68	137	251	237	239	239	228	227	87	71	201
172	105	207	233	233	214	220	239	228	98	74	206
188	88	179	209	185	215	211	158	139	75	20	169
189	97	165	84	10	168	134	11	31	62	22	148
199	168	191	193	158	227	178	143	182	106	36	190
205	174	155	252	236	231	149	178	228	43	95	234
190	216	116	149	236	187	85	150	79	38	218	241
190	224	147	108	227	210	127	102	36	101	255	224
190	214	173	66	103	143	95	50	2	109	249	215
187	196	235	75	1	81	47	0	6	217	255	211
183	202	237	145	0	0	12	108	200	138	243	236
195	206	123	207	177	121	123	200	175	13	96	218



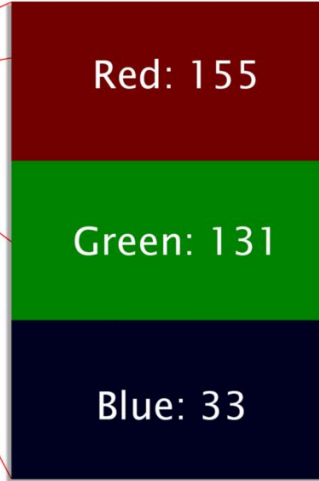
# Color channels



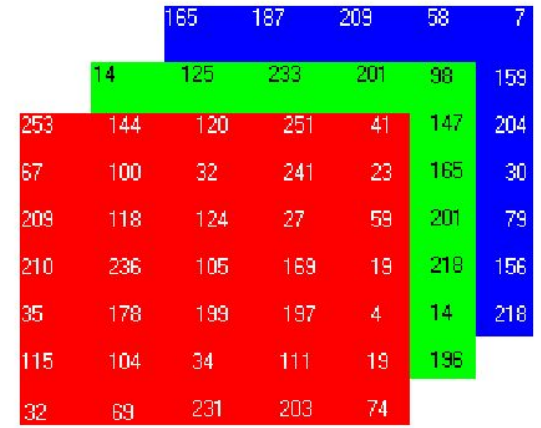
Original Image



Pixels



Color Channels



# Let's review Keras sequential models



## **Core concepts:**

train\_test\_split

Neurons

Layers (Dense)

Activation functions (Sigmoid, ReLu)

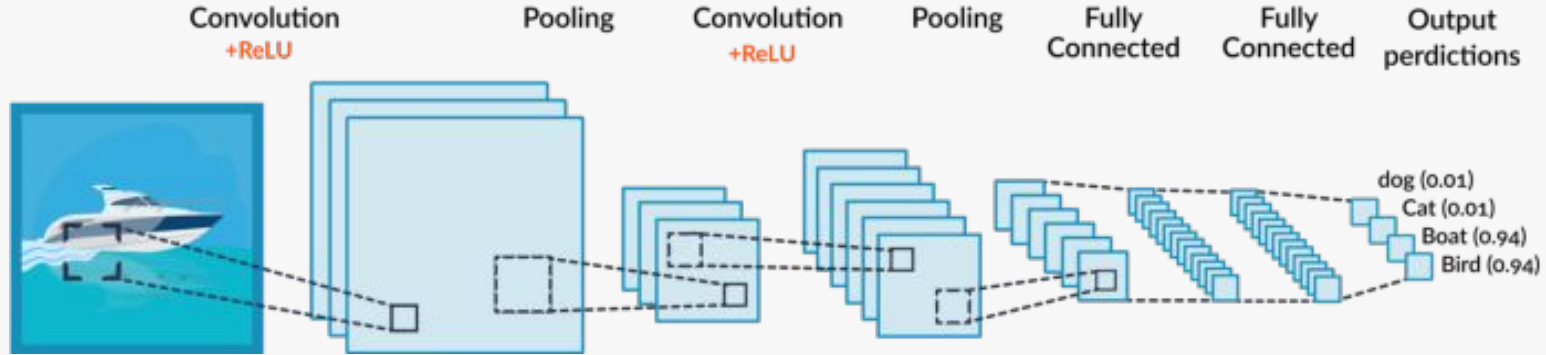
Loss Functions (MSE, Negative log loss, Cross entropy)

Optimizers (Adam)

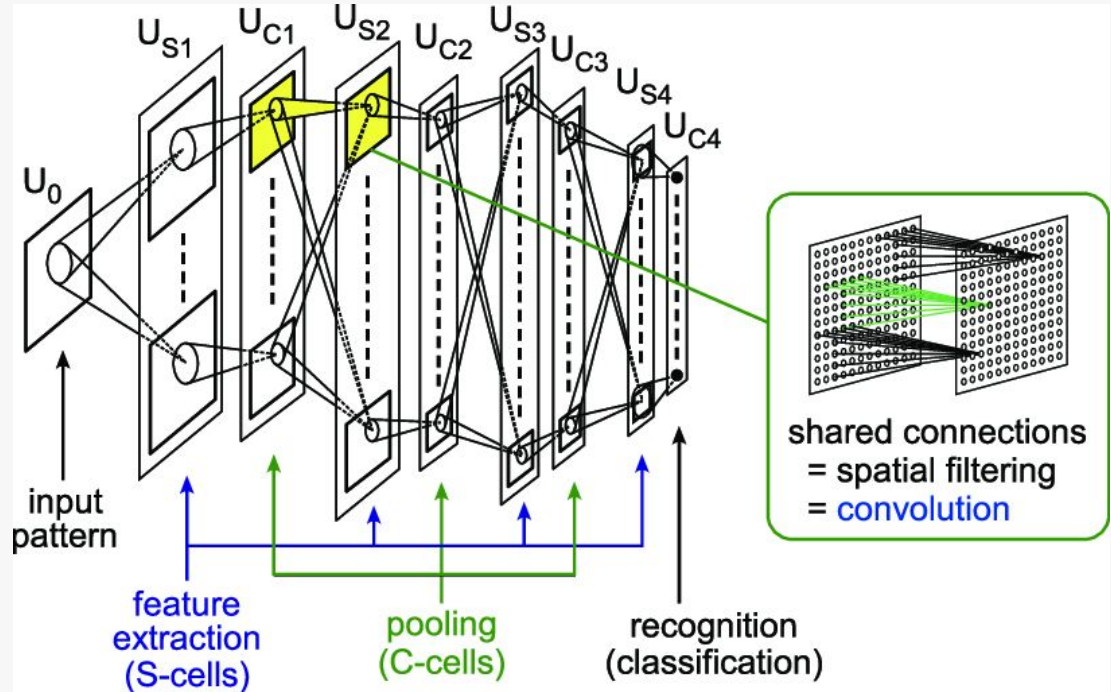
Training (Epochs, Batchsize)



# Convolutional Neural Networks



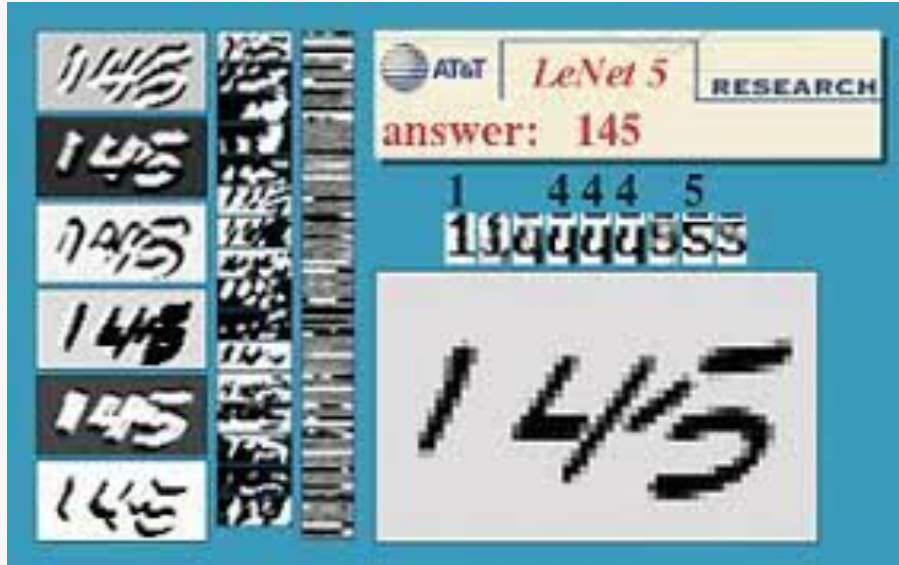
# Sharing weights



Fukushima and NeoCognitron



# The LeNet model

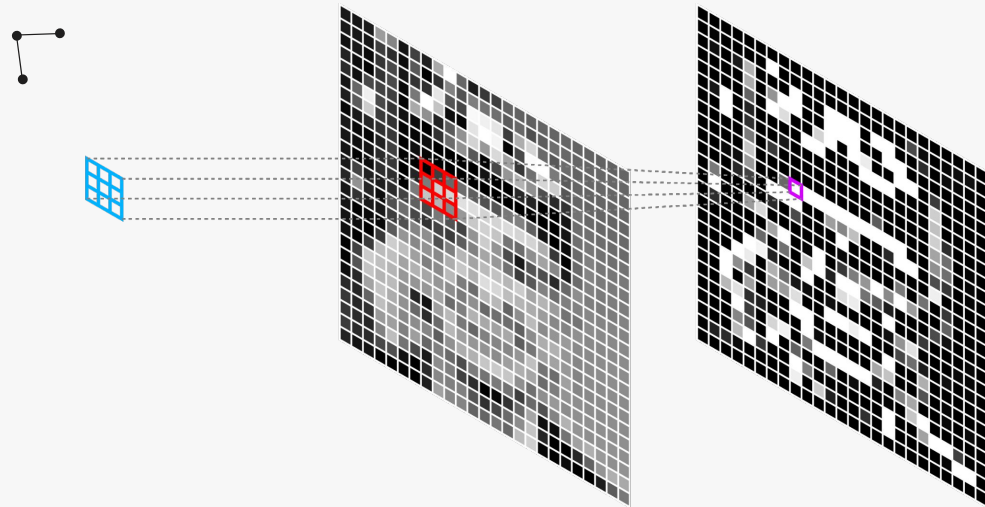


LeNet model demo - [Bell Labs Youtube Video](#)





# Convolutional Neural Networks



-1	-1	-1
-1	8	-1
-1	-1	-1

45	81	87
194	203	215
164	116	131

255\*

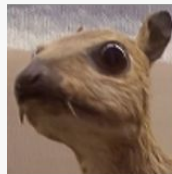
\* = max(255, 657)

**Kernel**

**Input**

**Output**

**Input**



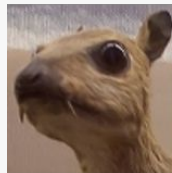
**Convolution filter**

$$\begin{bmatrix} -1 & -1 & -1 \\ -1 & 8 & -1 \\ -1 & -1 & -1 \end{bmatrix}$$

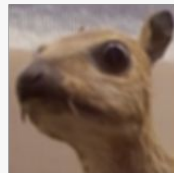
**Feature**



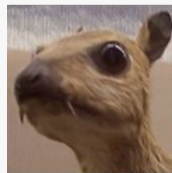
Edge



$$\frac{1}{9} \begin{bmatrix} 1 & 1 & 1 \\ 1 & 1 & 1 \\ 1 & 1 & 1 \end{bmatrix}$$



Blurred



$$\begin{bmatrix} 0 & -1 & 0 \\ -1 & 5 & -1 \\ 0 & -1 & 0 \end{bmatrix}$$



Sharpen

# Convolutional Neural Networks



Pixel Values

1	0	4	2	125	67
8	2	5	4	34	12
20	13	25	15	240	2
76	8	6	6	100	76
34	66	134	223	201	3
255	123	89	55	32	2



Kernel 3 x 3 Pixels

1	2	1
2	4	2
1	2	1



Convolved Image

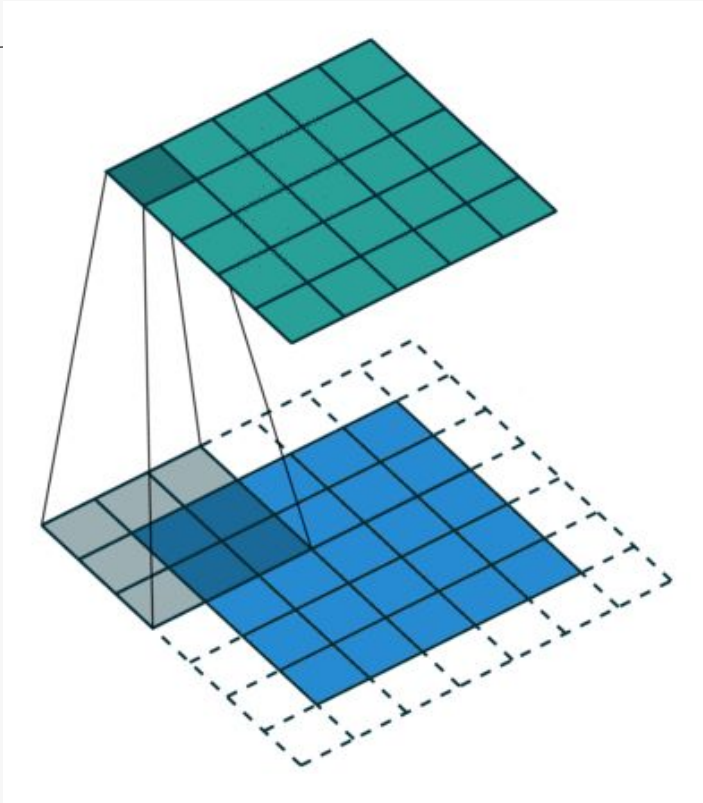
		198			

$$\begin{aligned}2 \times 1 &= 2 \\2 \times 5 &= 10 \\1 \times 4 &= 4 \\2 \times 13 &= 26 \\25 \times 4 &= 100 \\15 \times 2 &= 30 \\8 \times 1 &= 8 \\6 \times 2 &= 12 \\6 \times 1 &= 6\end{aligned}$$

$$2 + 10 + 4 + 26 + 100 + 30 + 8 + 12 + 6 = 198$$



# Sliding a kernel over a padded image



# Pooling layer



2	2	7	3
9	4	6	1
8	5	2	4
3	1	2	6

Max Pool  
→

Filter - (2 x 2)  
Stride - (2, 2)

9	7
8	6



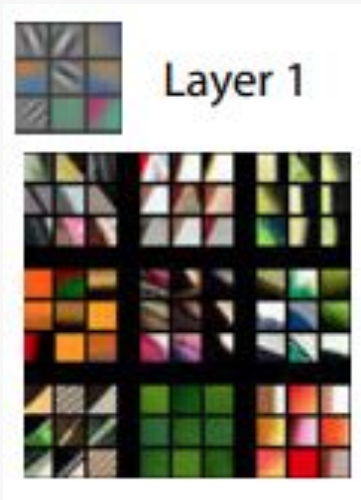
# 3D demo of NN Architectures



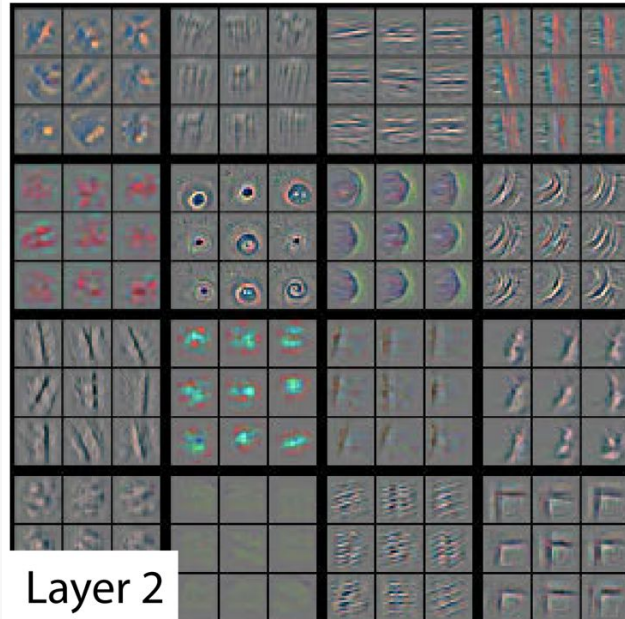
Video link: <https://youtu.be/3JQ3hYko51Y>



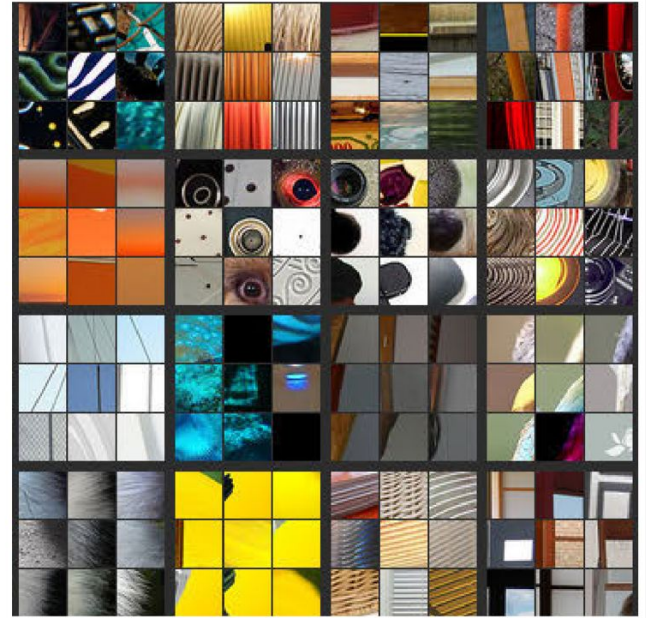
# What do the CNN Layers Learn 1&2



Layer 1

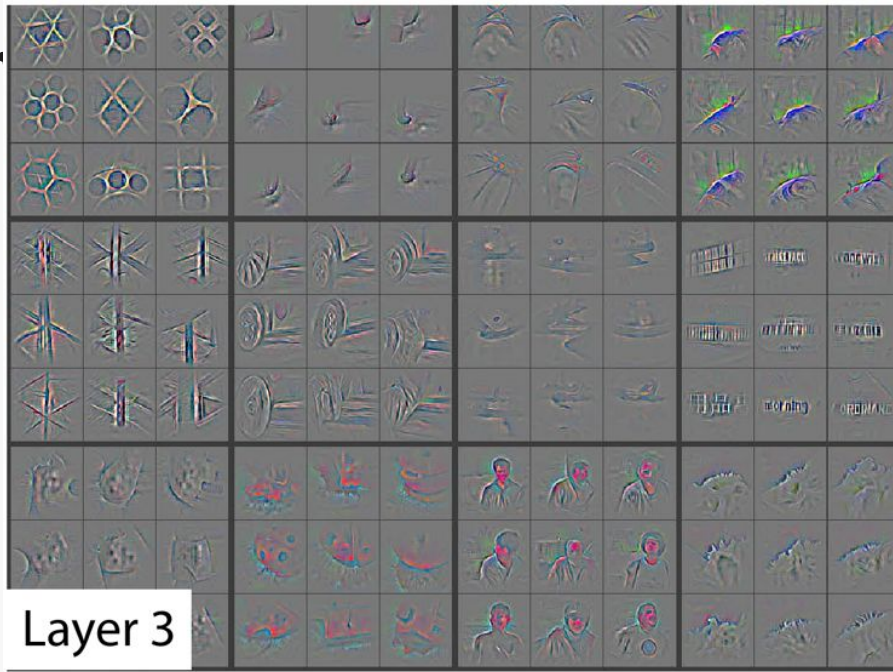


Layer 2

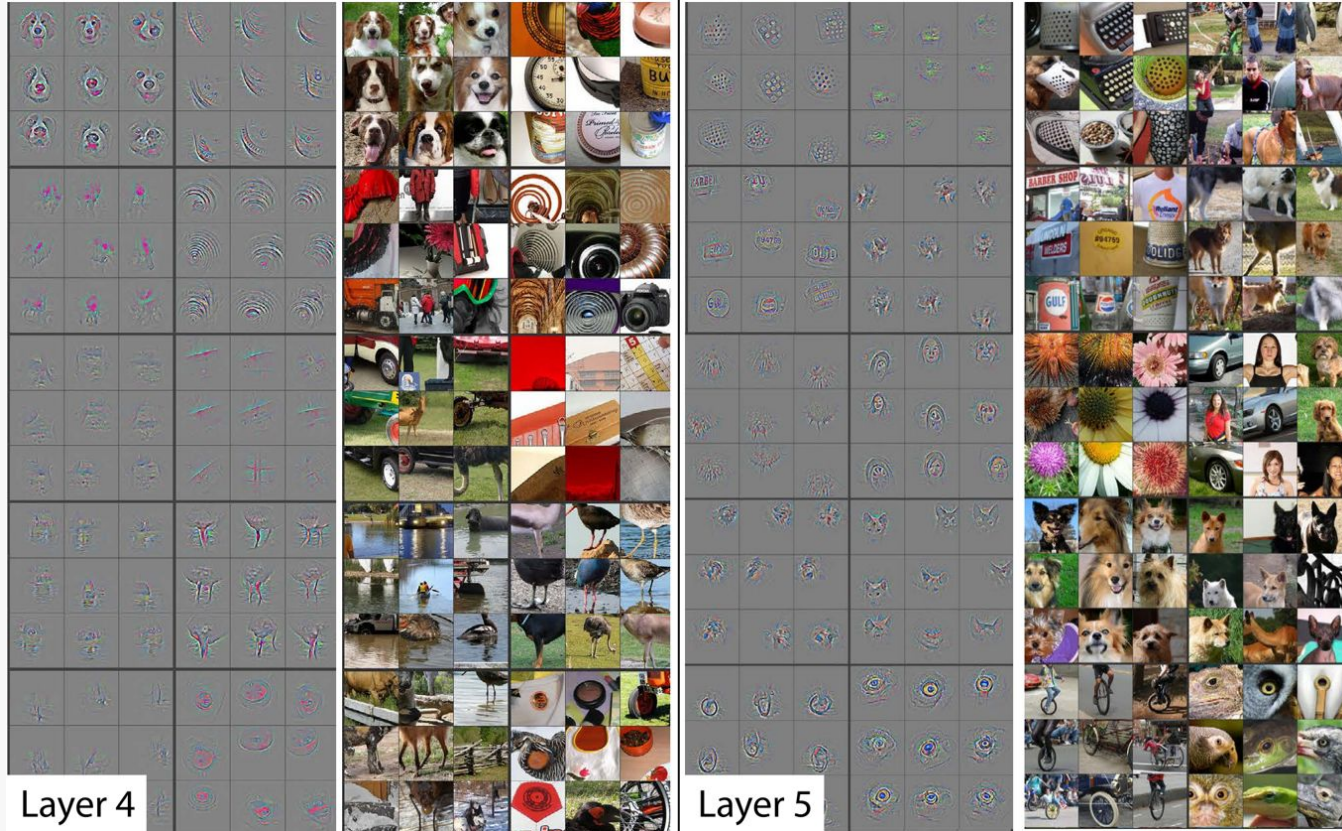




# What do the CNN Layers Learn

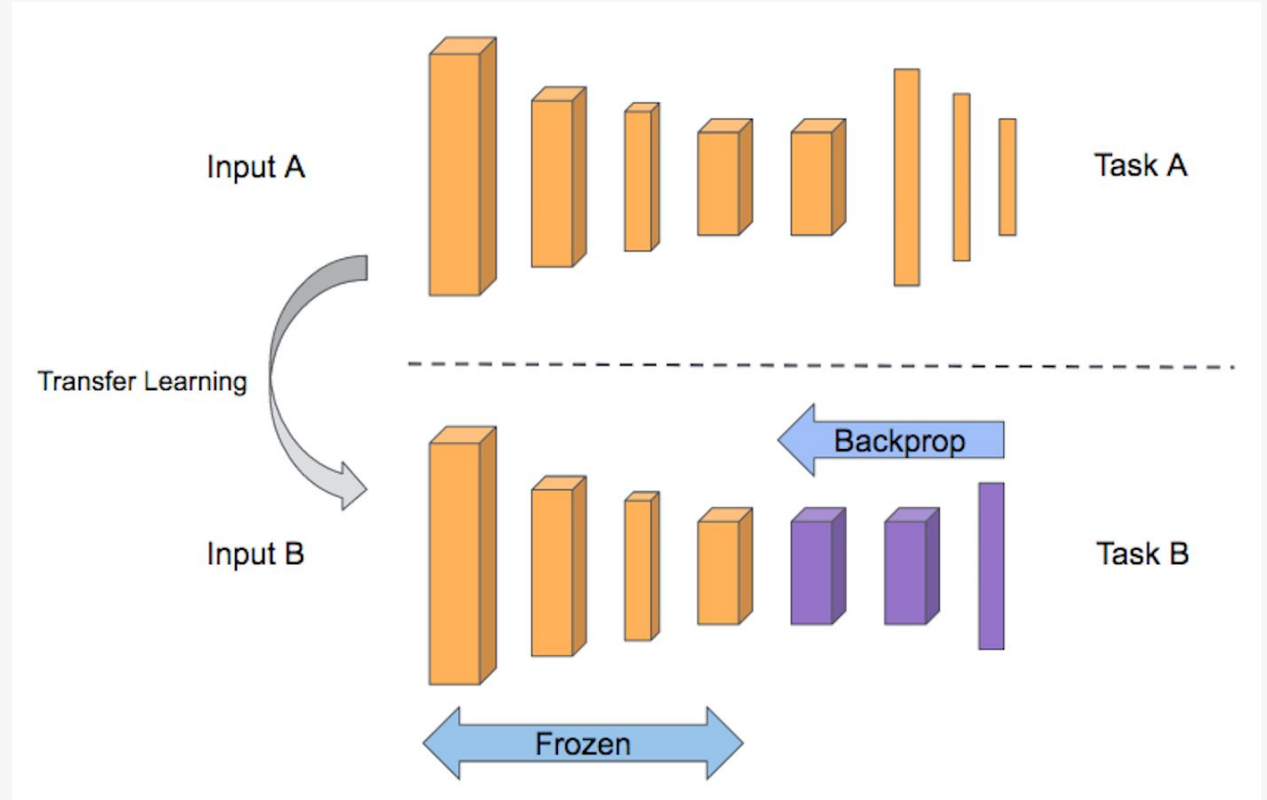
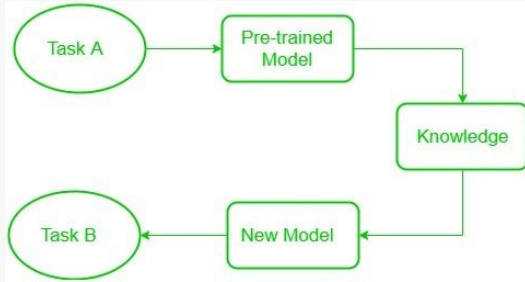


# What do the CNN Layers Learn





# Transfer Learning



# Pre-trained models



RESNET 50

ALEXNET

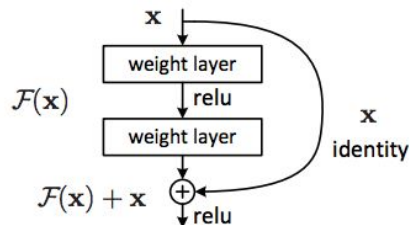


Figure 2. Residual learning: a building block.



Kaiming He

Annual Imagenet competition



# Hardware dependencies

## Why a GPU?

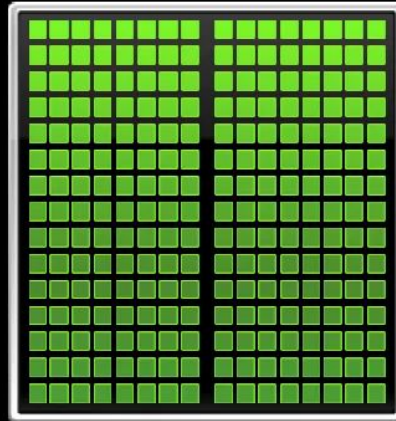
**CPU**

Optimized for  
Serial Tasks



**GPU**

Optimized for Many  
Parallel Tasks



## USE-CASES



Speech



Translate



Recommender

CONSUMER INTERNET



Healthcare



Manufacturing



Finance

INDUSTRIAL APPLICATIONS



Molecular  
Simulations



Weather  
Forecasting



Seismic  
Mapping

SUPERCOMPUTING

## APPS & FRAMEWORKS



Amber  
NAMD

+600  
Applications

CATIA



AUTODESK  
3DS MAX



## CUDA-X LIBRARIES

### MACHINE LEARNING

cuDF

cuML

cuGRAPH

### DL / HPC

cuDNN

CUTLASS

TENSORRT

CUDA Math Libraries

### LANGUAGES



python OpenACC



LLVM Compiler  
For CUDA

## CUDA

### CUDA TOOLKIT

CUDA  
COMPILER

#### DEVELOPER TOOLS

DEBUGGERS

PROFILERS

CUDA C++  
CORE

### CUDA DRIVER

MEMORY  
MANAGEMENT

WINDOWS &  
GRAPHICS

COMMS  
LIBRARIES

## OS PLATFORMS



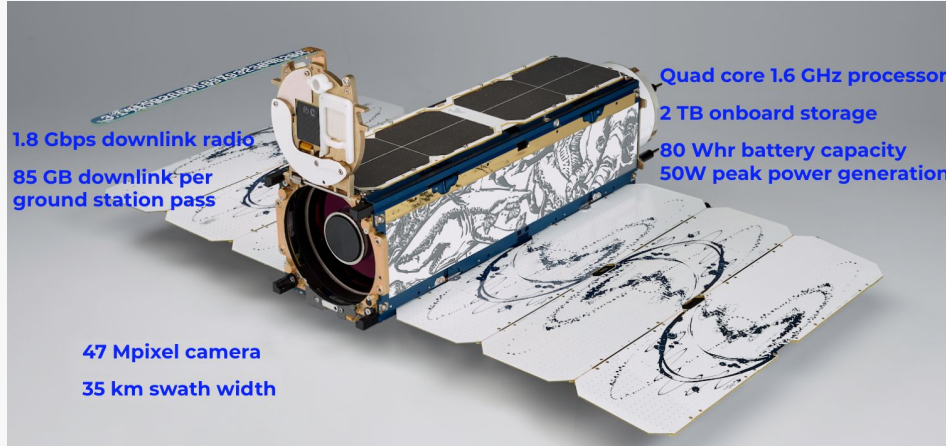
CentOS



Windows Server

Nvidia CUDA

# Transfer learning CNN Pytorch - hands on



Satellite image classification task.

