

### Aula 17 – Redes Neurais Convolucionais

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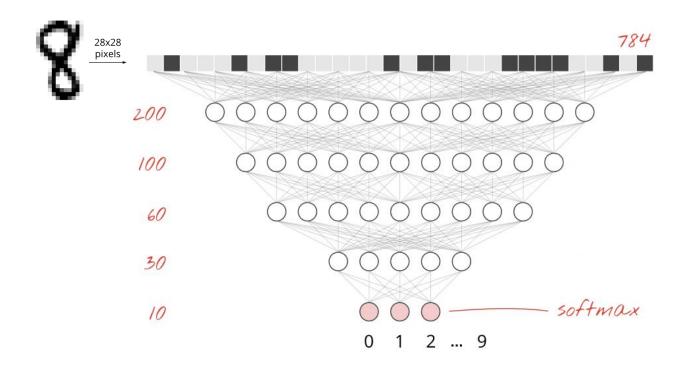
#### Roteiro



- Perceptron de multiplas camadas (MLP)
- Redes Neurais Convolucionais (CNNs)
- Camada convolucional
- Camada de pooling
- Modelos
- Bibliotecas e ambientes de desenvolvimento
- Conjuntos de imagens

# Perceptron de multiplas camadas (MLP)

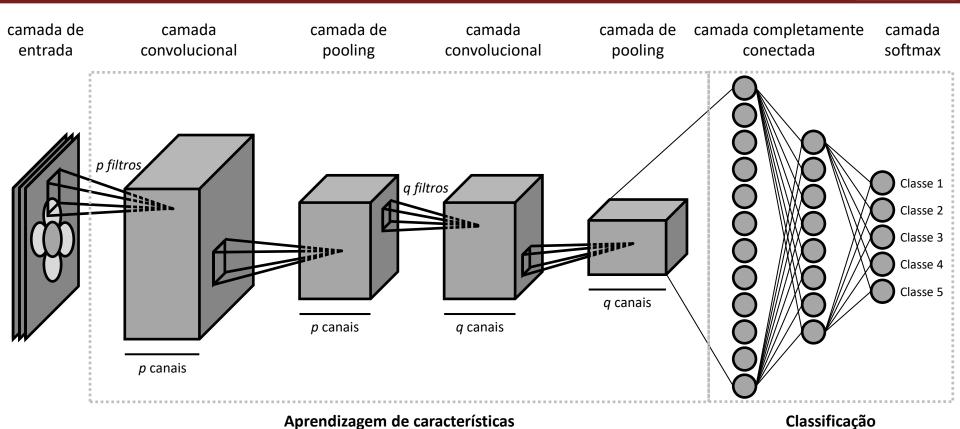




Learn TensorFlow and deep learning, without a Ph.D.

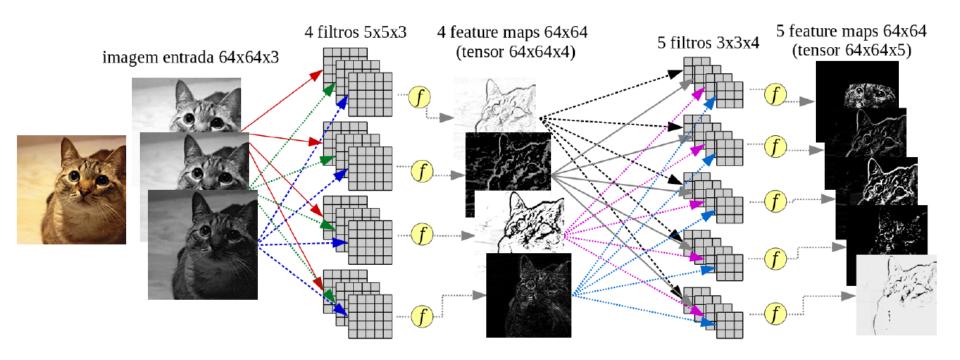
## Redes Neurais Convolucionais (CNNs)





## Redes Neurais Convolucionais (CNNs)

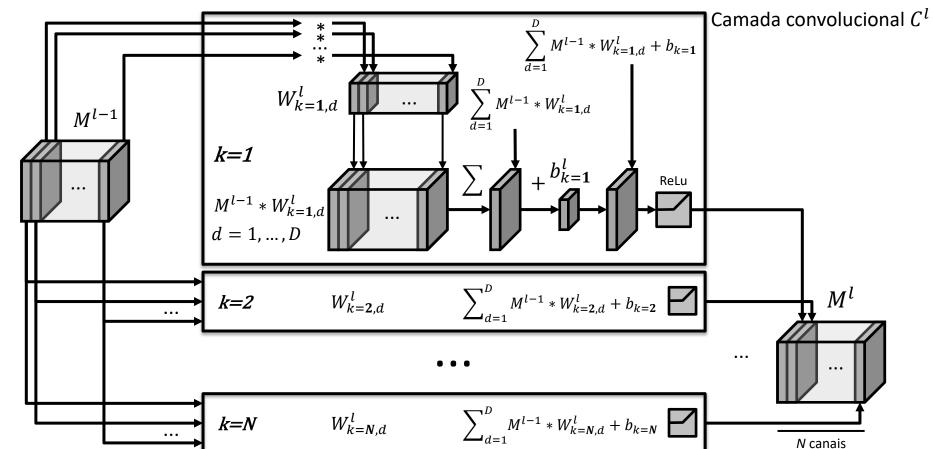




Moacir Ponti. http://conteudo.icmc.usp.br/pessoas/moacir/p17sibgrapi-tutorial/

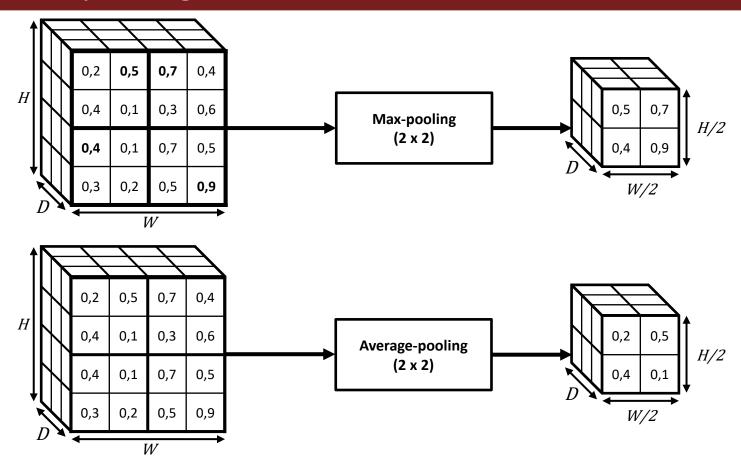
### Camada convolucional





# Camada de pooling



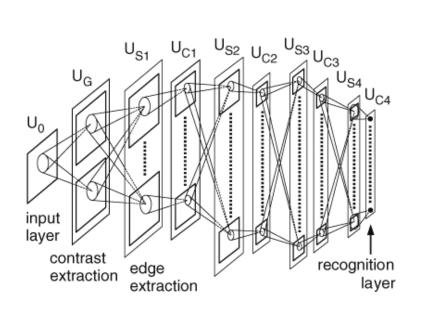


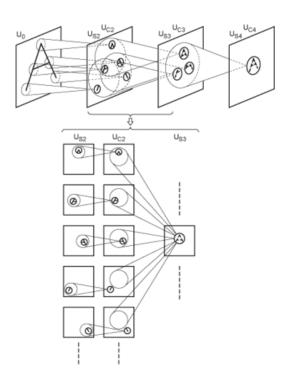


# MODELOS

# Neocognitron (1980)









Kunihiko Fukushima

# LeNet-5 (1998)



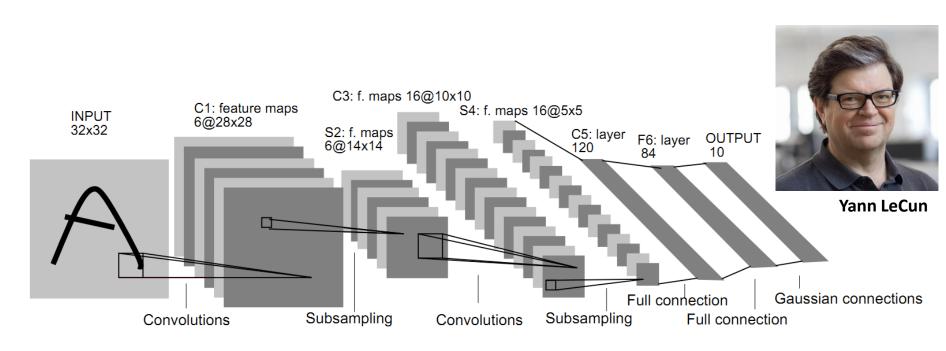
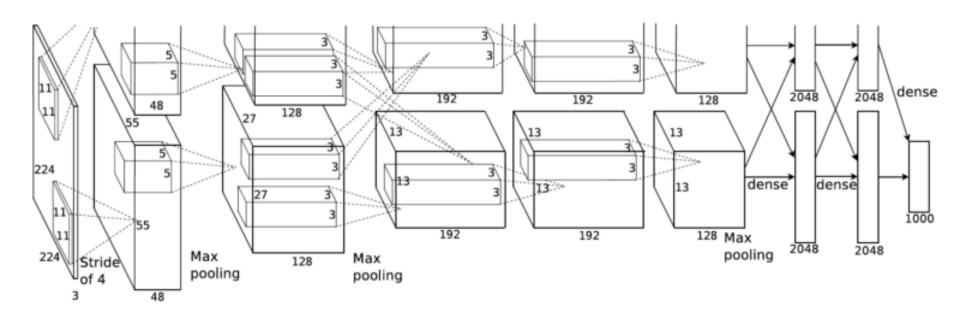


Fig. 2. Architecture of LeNet-5, a Convolutional Neural Network, here for digits recognition. Each plane is a feature map, i.e. a set of units whose weights are constrained to be identical.

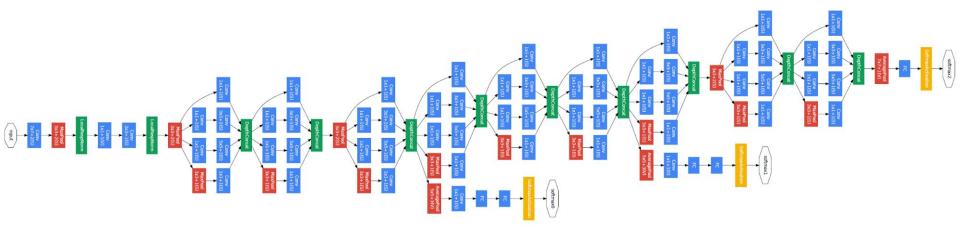
# AlexNet (2012)





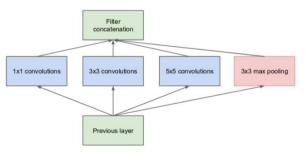
# Inception (GoogLeNet) (2014)



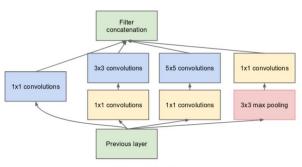


# Módulos Inception

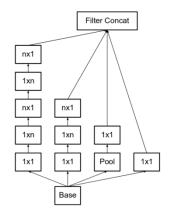


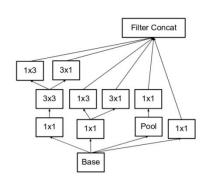


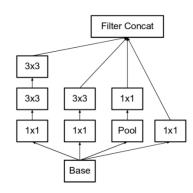
(a) Inception module, naïve version



(b) Inception module with dimension reductions

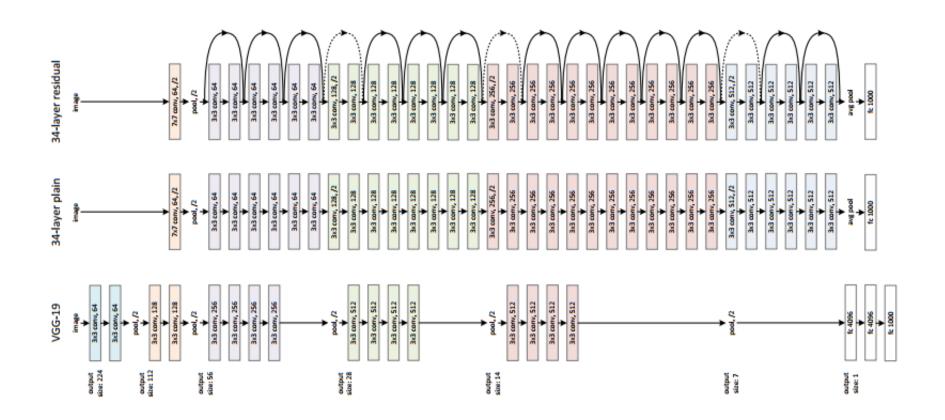






# VGG (2014) e ResNet (2015)







# **BIBLIOTECAS E AMBIENTES DE DESENVOLVIMENTO**

#### Bibliotecas e ambientes de desenvolvimento



- O treinamento de CNNs possui alto custo computacional.
  - Recomenda-se que sejam treinados usando GPUs.
  - O Google Colab fornece acesso à GPUs (com algumas restrições).





### Bibliotecas e ambientes de desenvolvimento



- Principais bibliotecas para Deep Learning e Redes Neurais Convolucionais
  - PyTorch
    - https://pytorch.org/
  - Tensorflow
    - https://www.tensorflow.org/





#### Bibliotecas e ambientes de desenvolvimento



#### Anaconda Distribution:

- Distribuição Python com suporte às principais bibliotecas
- https://www.anaconda.com/products/distribution

#### Google Colab:

- Ambiente de execução em nuvem com GPUs.
- https://colab.research.google.com







# **CONJUNTOS DE IMAGENS**



- MNIST
  - <a href="http://yann.lecun.com/exdb/mnist/">http://yann.lecun.com/exdb/mnist/</a>
  - 60,000 training images
  - 10,000 testing images
  - 28 x 28 pixels
  - Níveis de cinza





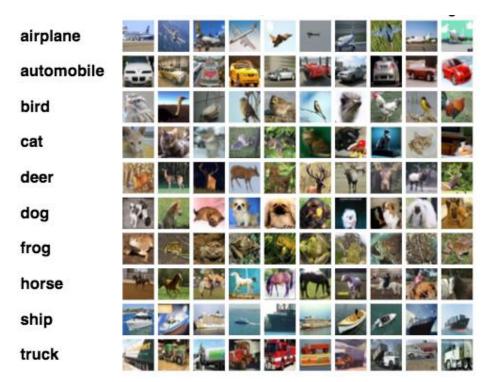
- Cats vs. Dogs
  - <a href="https://www.kaggle.com/c/dogs-vs-cats">https://www.kaggle.com/c/dogs-vs-cats</a>
  - 25,000 images de treinamento
  - 12,500 imagens de teste
  - 2 classes
  - Diversos tamanhos
  - RGB



Sample of cats & dogs images from Kaggle Dataset



- CIFAR10
  - https://www.cs.toronto.edu/~kriz/cifar.html
  - 50,000 training images
  - 10,000 testing images
  - 10 classes
  - 32 x 32 pixels
  - RGB





- ImageNet
  - <a href="https://www.image-net.org/">https://www.image-net.org/</a>
  - ~1,000,000 imagens
  - 1,000 classes
  - RGB





# Bibliografia



- Prof. Moacir Ponti (ICMC-USP). Material para o minicurso Deep Learning
  - https://github.com/maponti/deeplearning intro datascience
- Learn TensorFlow and deep learning, without a Ph.D.
  - https://cloud.google.com/blog/products/gcp/learn-tensorflow-and-deep-learningwithout-a-phd
- CS231n: Convolutional Neural Networks for Visual Recognition
  - <a href="http://cs231n.github.io/">http://cs231n.github.io/</a>
- Goodfellow, Bengio e Courville. Deep Learning. MIT Press, 2016
  - https://www.deeplearningbook.org/
- The MathWorks, Inc. What is a Convolutional Neural Network? 3 things you need to know.
  - https://www.mathworks.com/discovery/convolutional-neural-network-matlab.html

# Bibliografia



- Rodrigues, L. F.; Naldi M. C., **Mari, J. F.** Comparing convolutional neural networks and preprocessing techniques for HEp-2 cell classification in immunofluorescence images. **Computers in Biology and Medicine**, 2019.
  - https://doi.org/10.1016/j.compbiomed.2019.103542



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### FIM DA DISCIPLINA!