

convolutional neural networks, swift and iOS 12

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overview

- **goal: give you a boost along ml path**
- **do cnn/nn review, things to study, discuss a framework for tackling problems**
- **current tools, different ideas on how to approach things**
- **state of the art, beyond**

enter the temple



machine learning

THIS IS YOUR MACHINE LEARNING SYSTEM?

YUP! YOU POUR THE DATA INTO THIS BIG PILE OF LINEAR ALGEBRA, THEN COLLECT THE ANSWERS ON THE OTHER SIDE.

WHAT IF THE ANSWERS ARE WRONG?

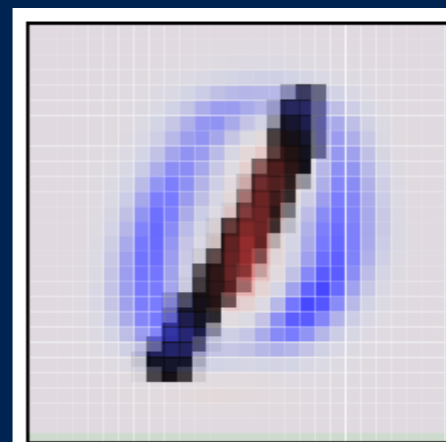
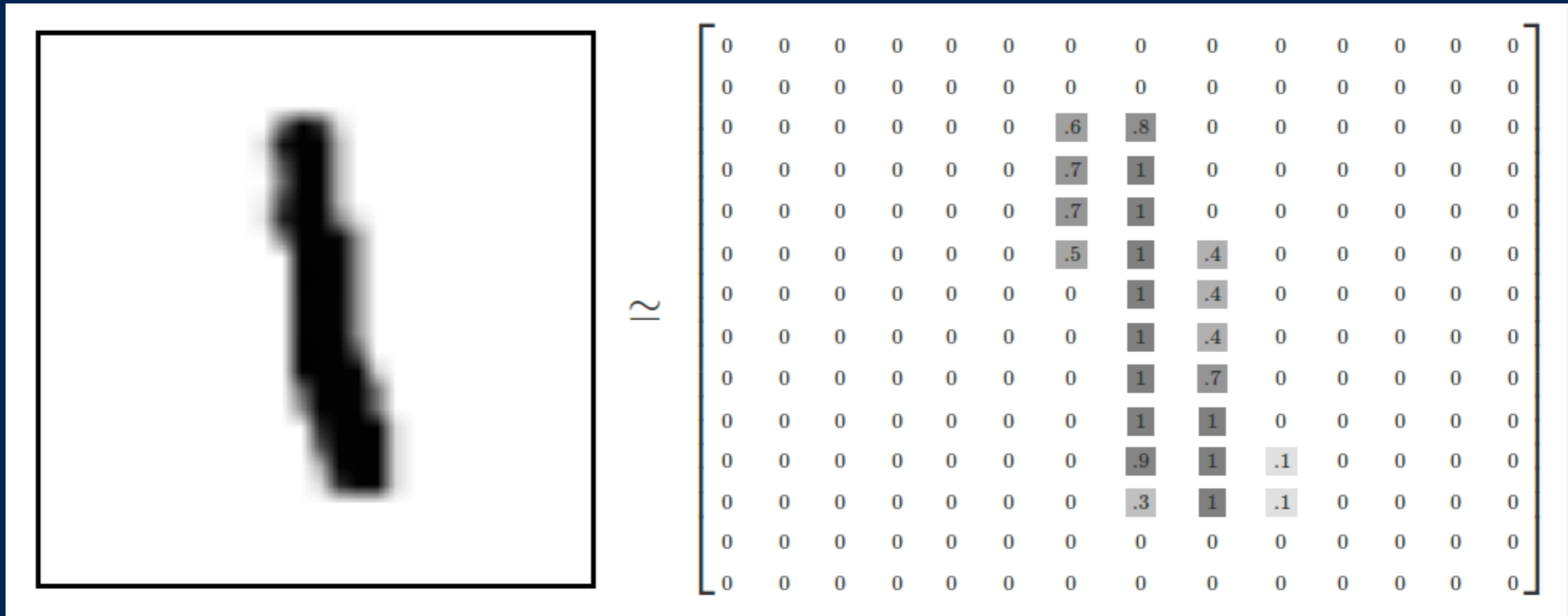
JUST STIR THE PILE UNTIL THEY START LOOKING RIGHT.



ml concepts

- **an input (numbers, image, audio, video)**
- **known data (supervised learning)**
- **combine to produce function/black box**
- **train model, use on unknown data**
- **goals: quality, size, complexity**

mnist: hello world

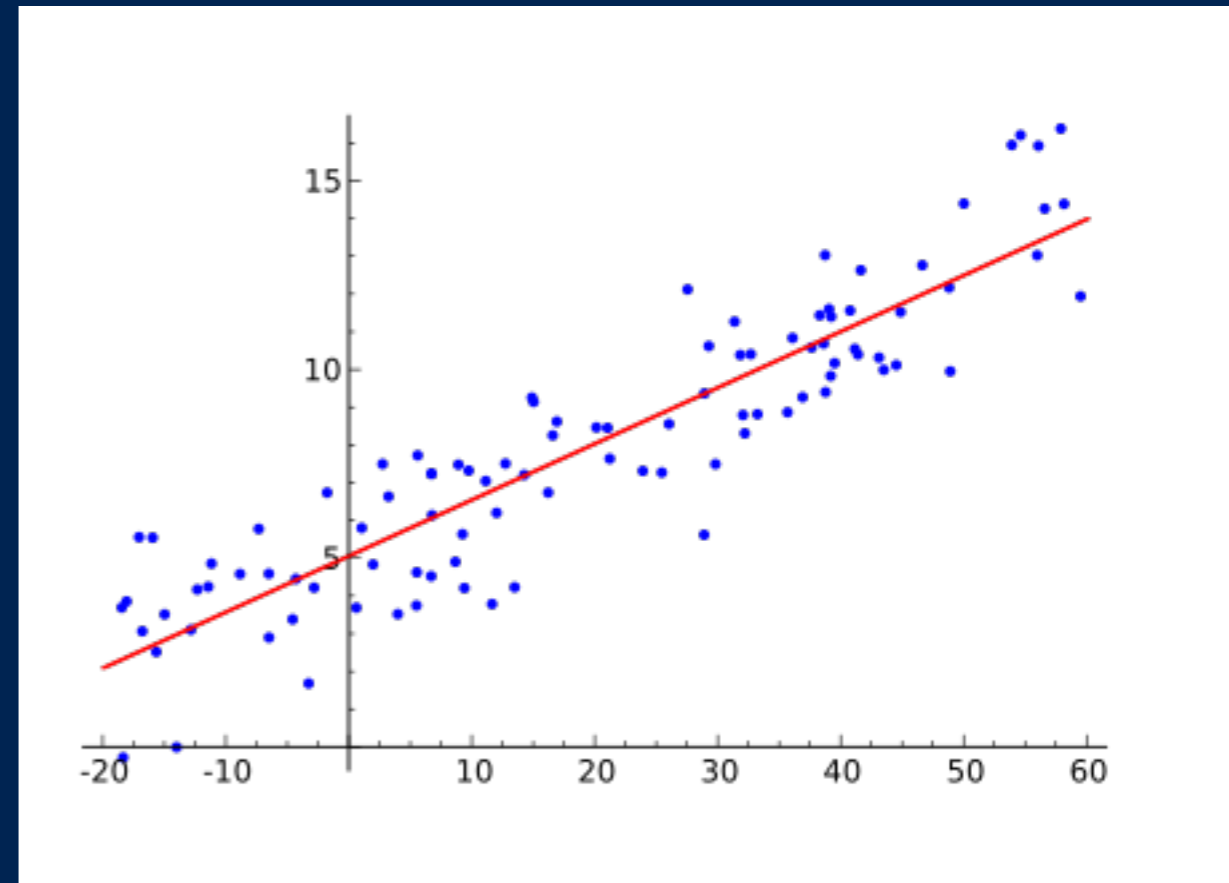


five easy pieces

- **linear regression**
- **random forests**
- **support vector machines**
- **gradient boosted trees**
- **neural network**

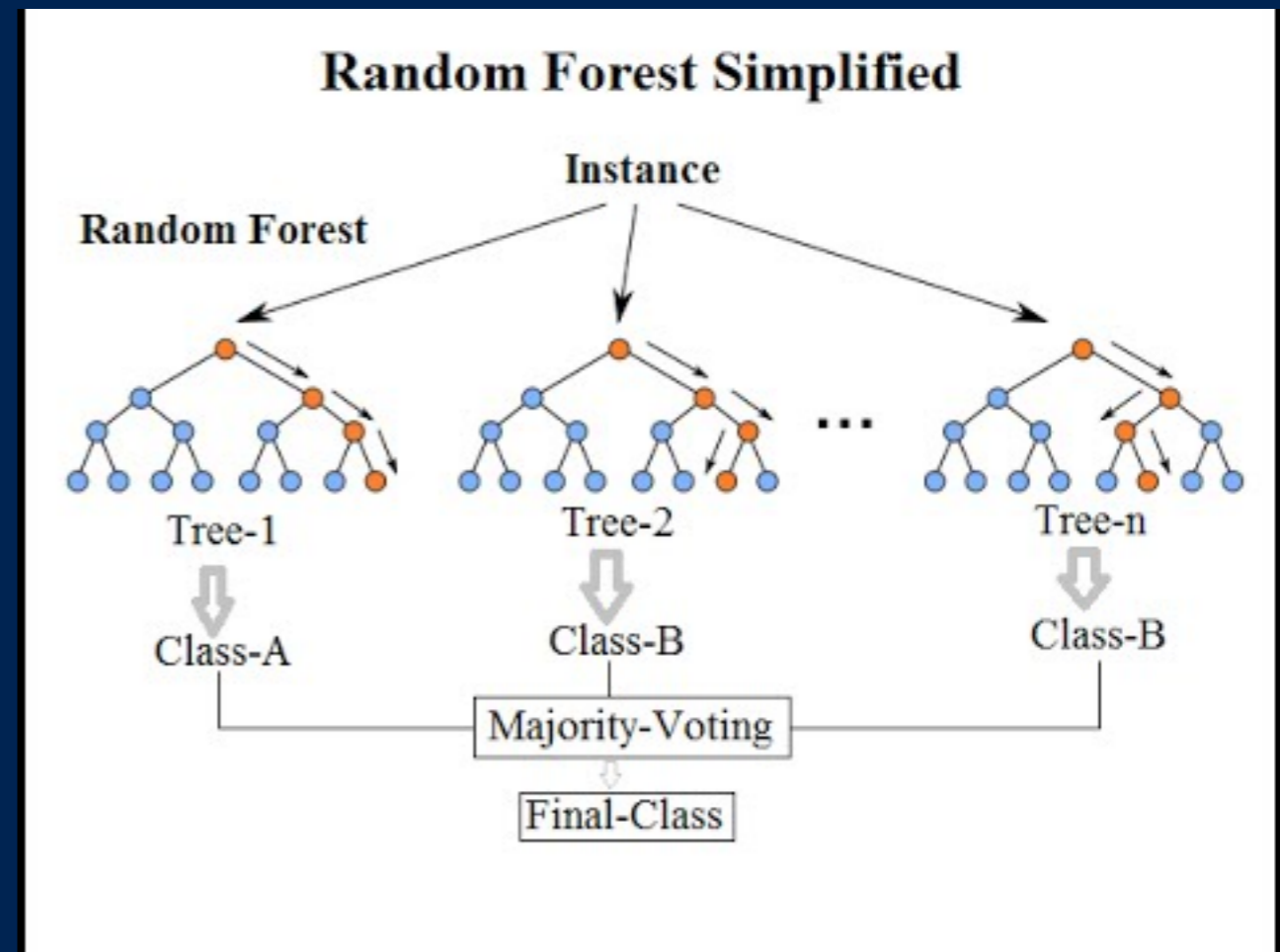
linear regression

- **points \rightarrow slope == linear regression**
- **think of adding all the points you have as one epoch**



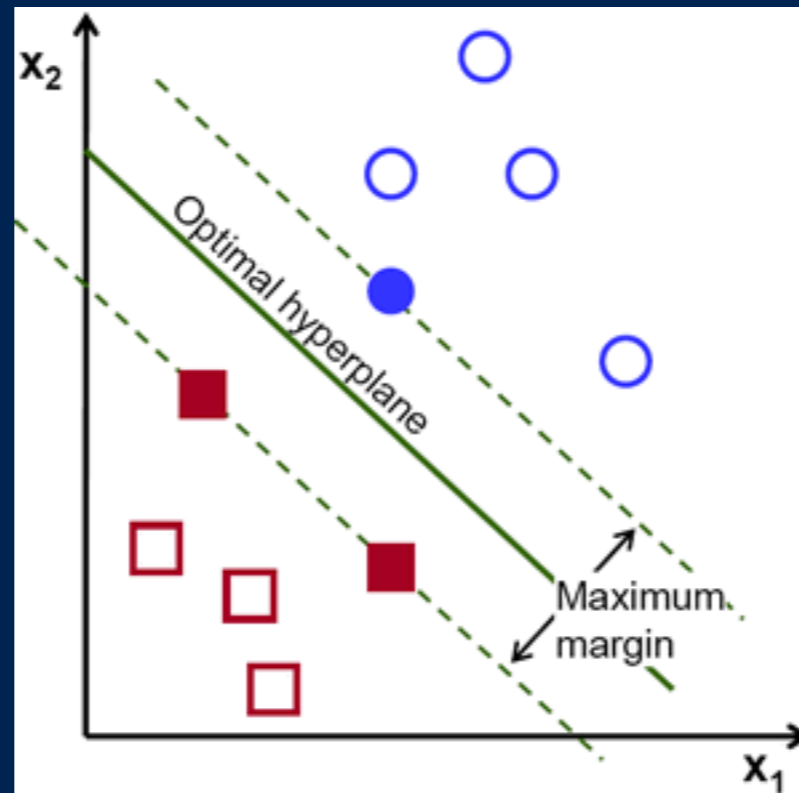
random forests

- **decision trees + sampling → rf**
- **very robust to noise**
- **cheap**



support vector machines

- **mathy approach to separating data**
- **kernel tricks for finding features**



1 Polynomial Kernel

2 Gaussian Kernel

3 Gaussian Radial Basis Function (RBF)

4 Laplace RBF Kernel

5 Hyperbolic Tangent Kernel

6 Sigmoid Kernel

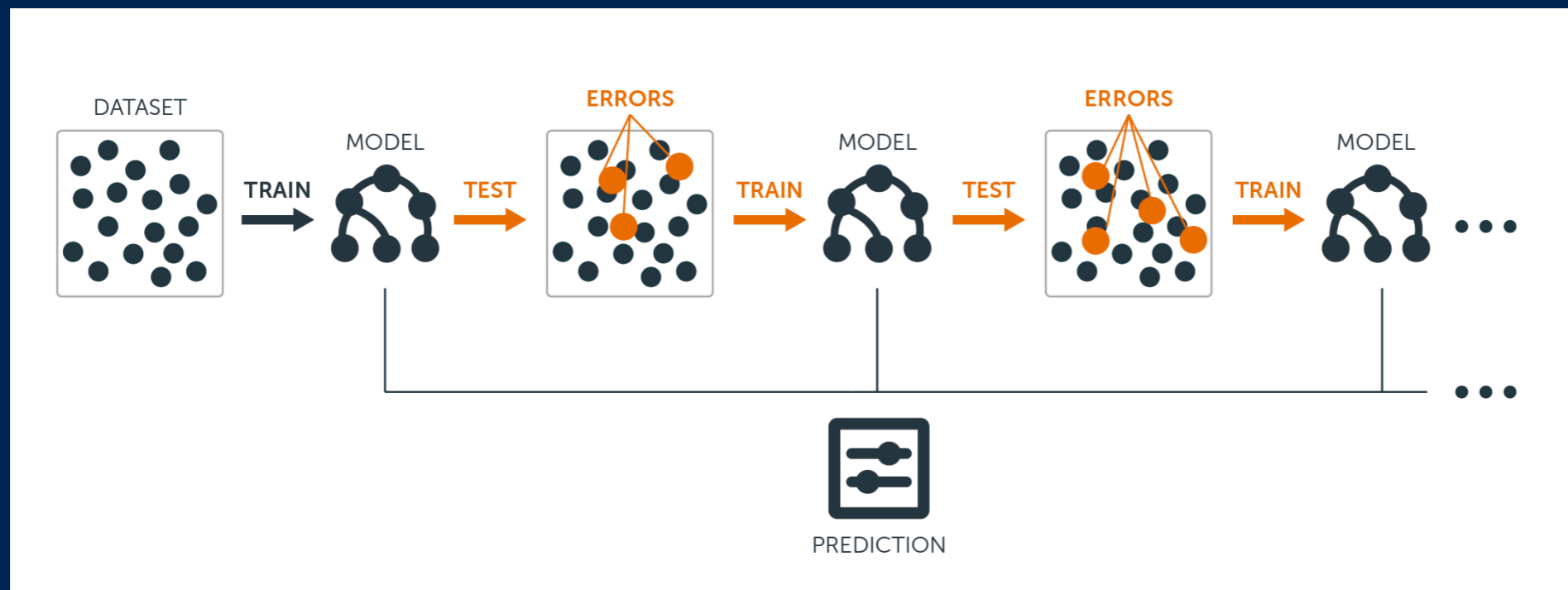
7 Bessel Function of First Kind Kernel

8 Anova Radial Basis Kernel

9 Linear spline kernel in 1d

gradient boosted trees

- **random forests + linear regression == tree ensembles == gbt**
- **powerful when you have feature data and want to find interesting correlations**



neural network

- **1 layer nn == linear regression**
- **2 layer nn == neural network**
- **feed forward neural network**
- **tensorflow.js mnist layers example**

Neural Networks

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-  Backfed Input Cell
-  Input Cell
-  Noisy Input Cell
-  Hidden Cell
-  Probabilistic Hidden Cell
-  Spiking Hidden Cell
-  Output Cell
-  Match Input Output Cell
-  Recurrent Cell
-  Memory Cell
-  Different Memory Cell
-  Kernel
-  Convolution or Pool

Deep Feed Forward (DFF)



Perceptron (P)



Feed Forward (FF)



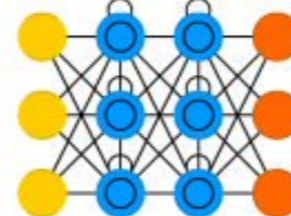
Radial Basis Network (RBF)



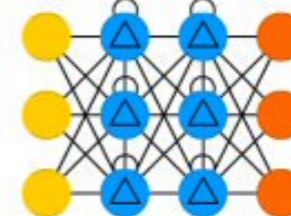
Recurrent Neural Network (RNN)



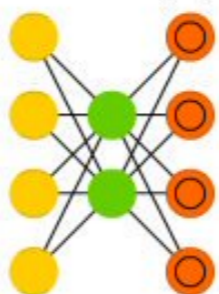
Long / Short Term Memory (LSTM)



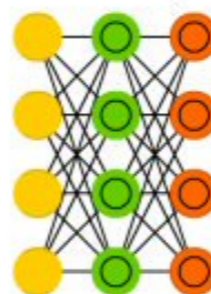
Gated Recurrent Unit (GRU)



Auto Encoder (AE)



Variational AE (VAE)



Denosing AE (DAE)



Sparse AE (SAE)



Markov Chain (MC)



Hopfield Network (HN)



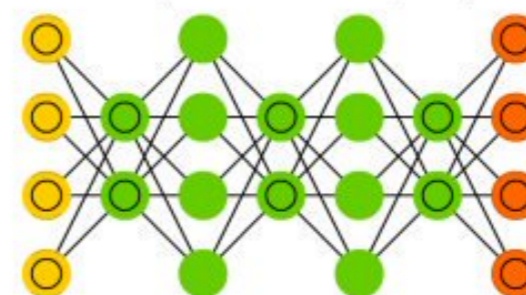
Boltzmann Machine (BM)



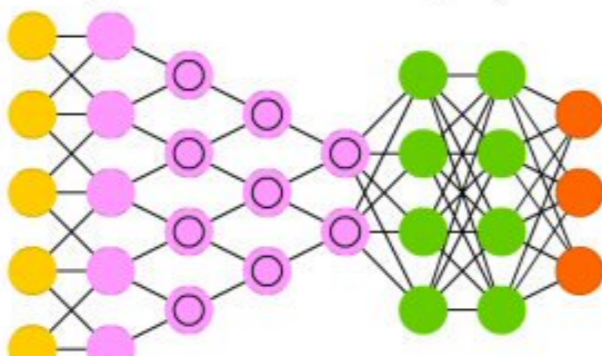
Restricted BM (RBM)



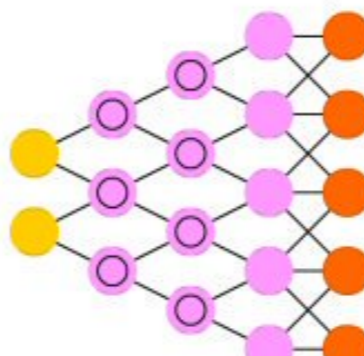
Deep Belief Network (DBN)



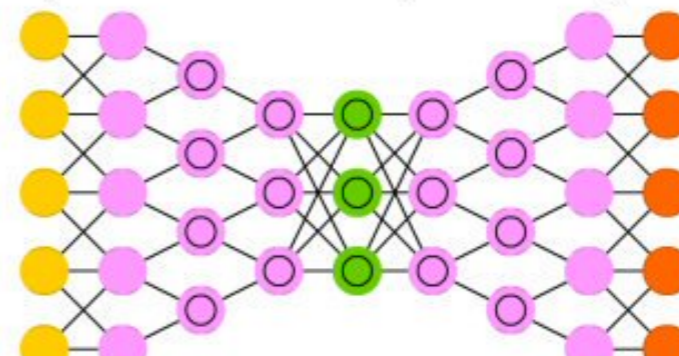
Deep Convolutional Network (DCN)



Deconvolutional Network (DN)



Deep Convolutional Inverse Graphics Network (DCIGN)



convolutions

- **convolution == matrix math == $a[x] + b$**
- **transform[image] + offset == $i1 \rightarrow i2$**

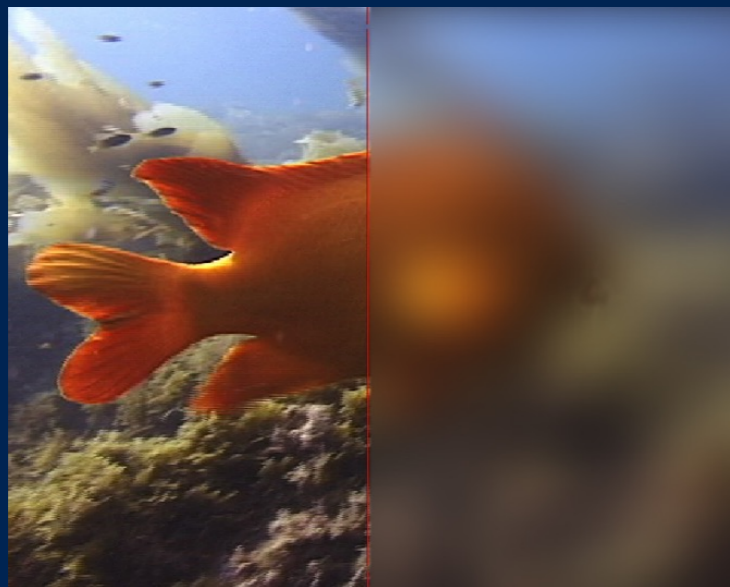
1/16	1/8	1/16
1/8	1/4	1/8
1/16	1/8	1/16

-1	0	1
-2	0	2
-1	0	1

Horizontal

-1	-2	-1
0	0	0
-1	-2	-1

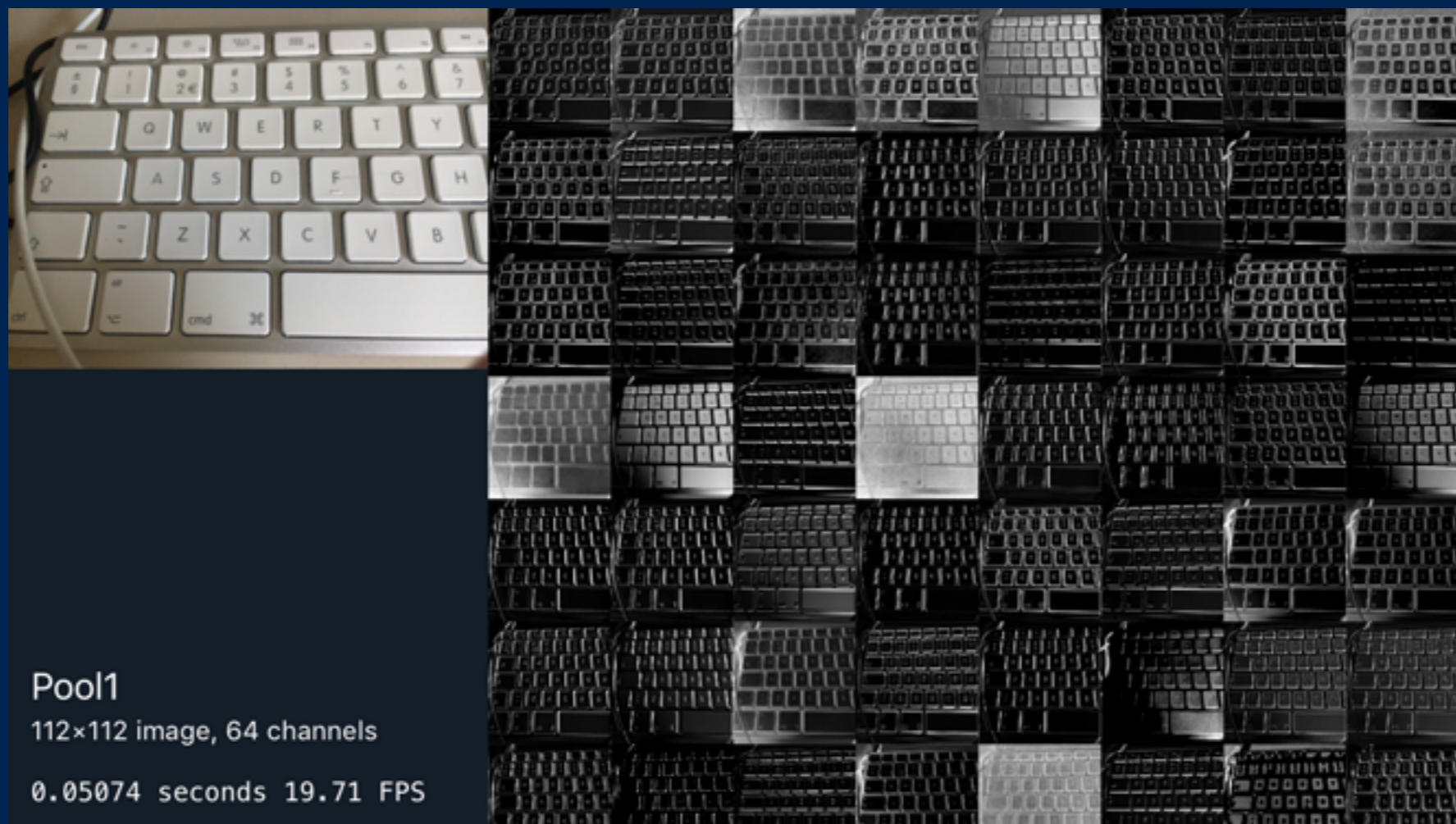
Vertical



conv: 3x3 striding

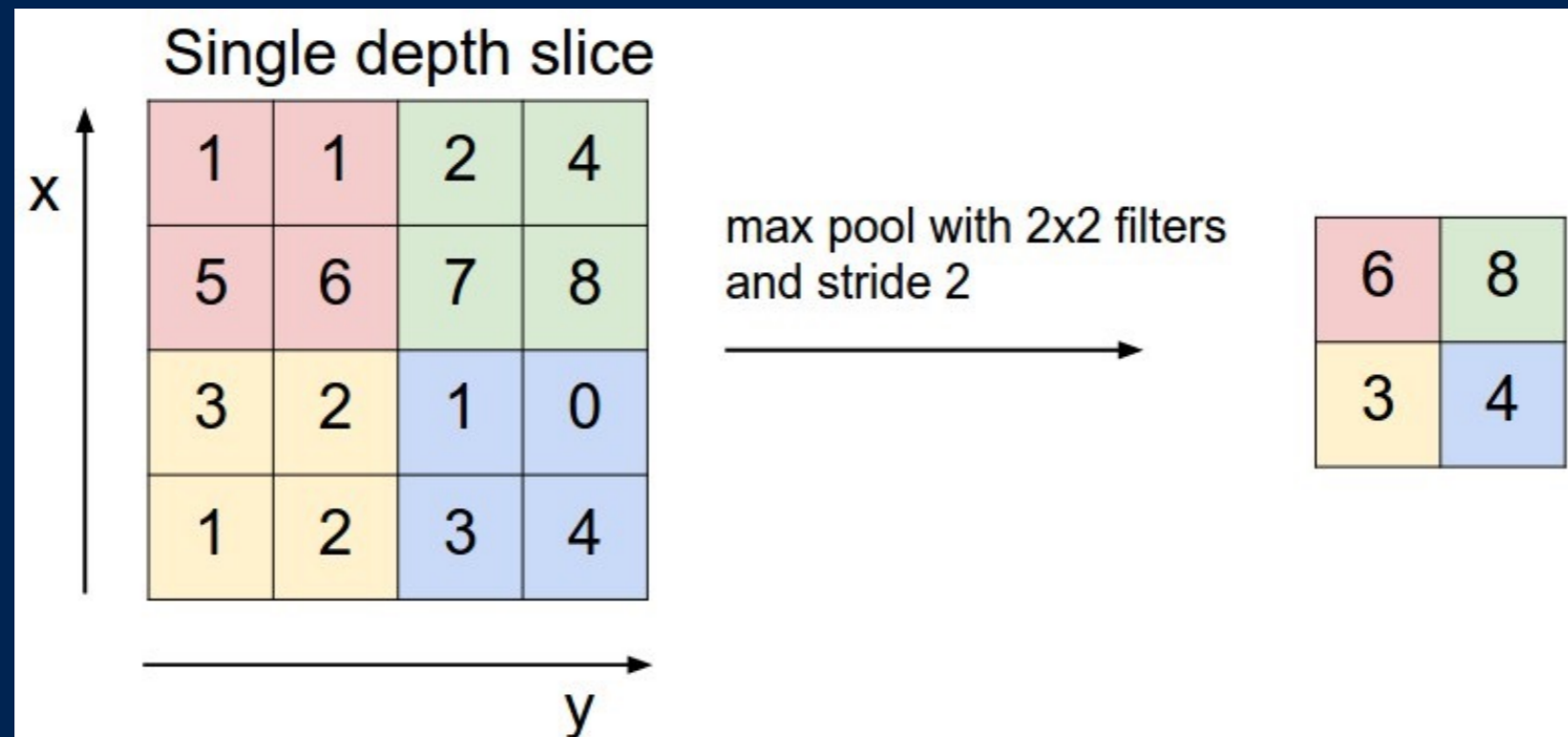
- **upsample input image into chunks**
- **[cs231n.github.io](https://github.com/cs231n)**

• **deepfish**

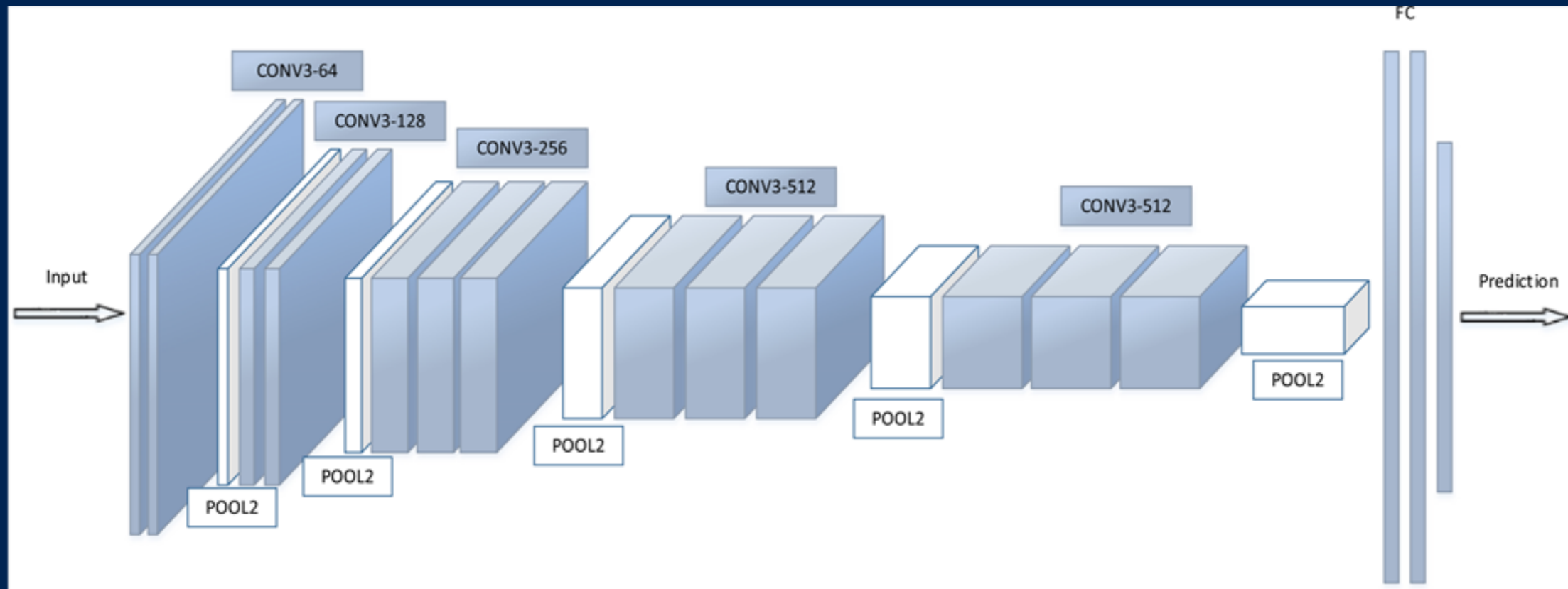
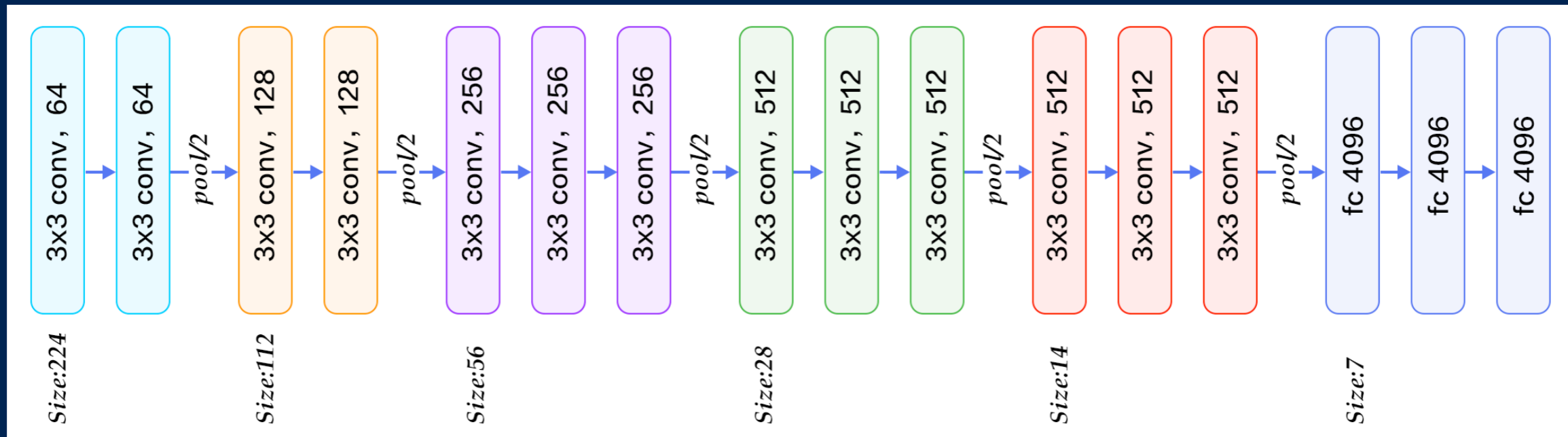


conv: maxpool

- **striding produces a lot of samples**
- **next: downsample the data!**

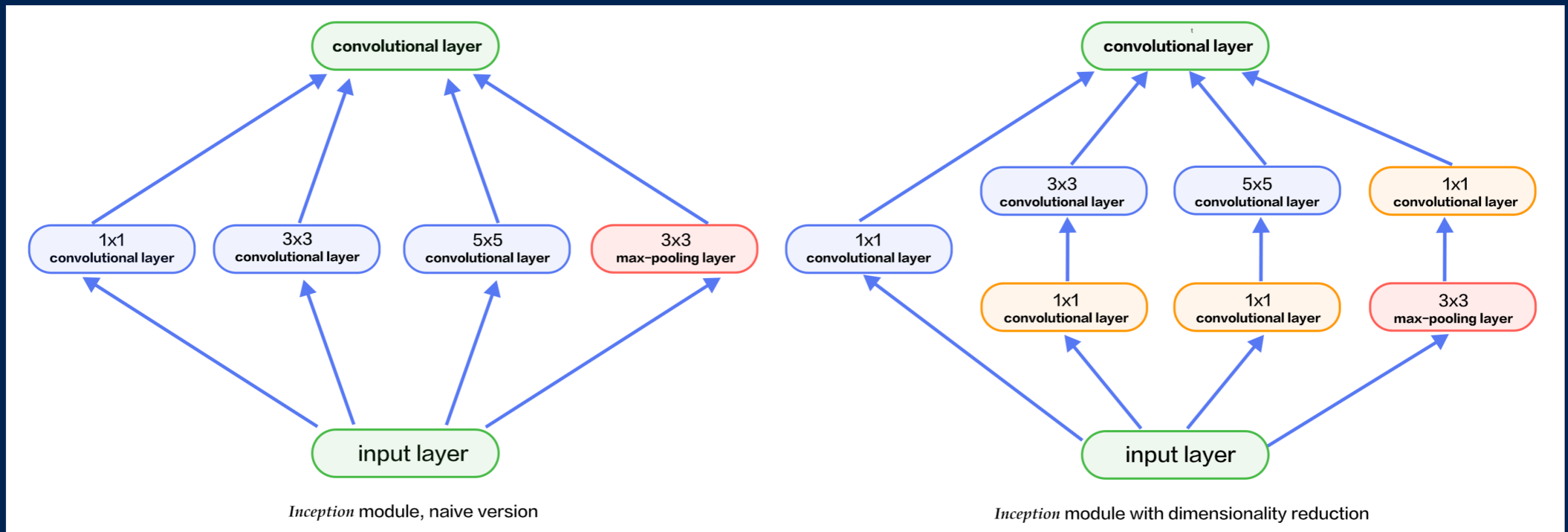


combined: vggnet



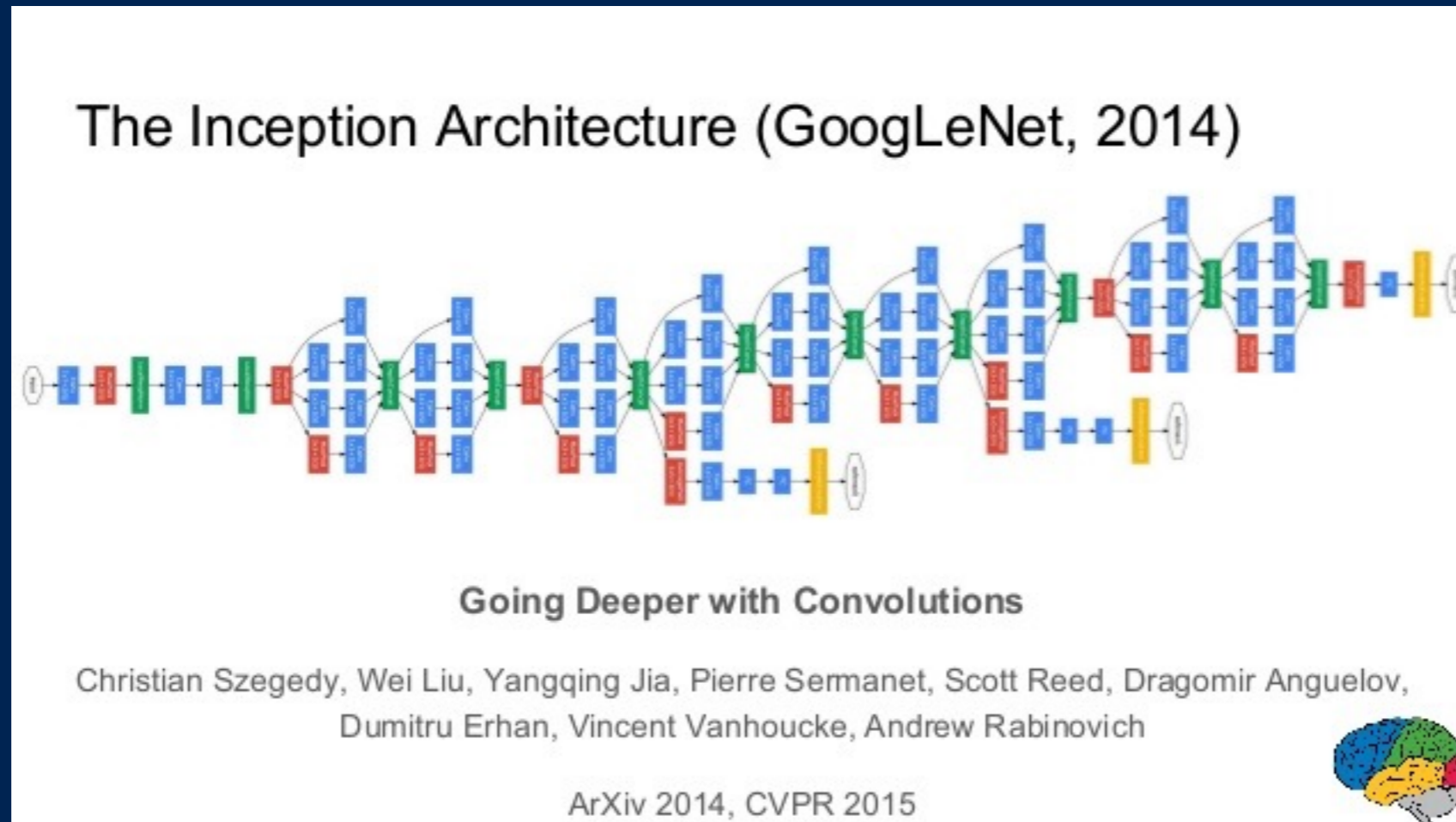
inception node

- **parallel execution, 1x1 convolution**



- **iamaaditya.github.io/2016/03/one-by-one-convolution/**

inception graph



- hacktilldawn.com/2016/09/25/inception-modules-explained-and-implemented/

walk the path

training

- **-1) python, roulette**
- **0) calc 1, linear algebra basics, geometry**
- **1) coursera, keras + tensorflow**
- **2) fast.ai 2018 sequence, pytorch**
- **3) read, practice, get into real world**

platform

- **0) cpu + tools**
- **1) basic vm's (coursera, paperspace)**
- **2) cloud software (aws, gcp)**
- **3) edge: mobile devices/embedded**
- **4) custom hardware (tpu, volta, asic)**

know your enemy

questions

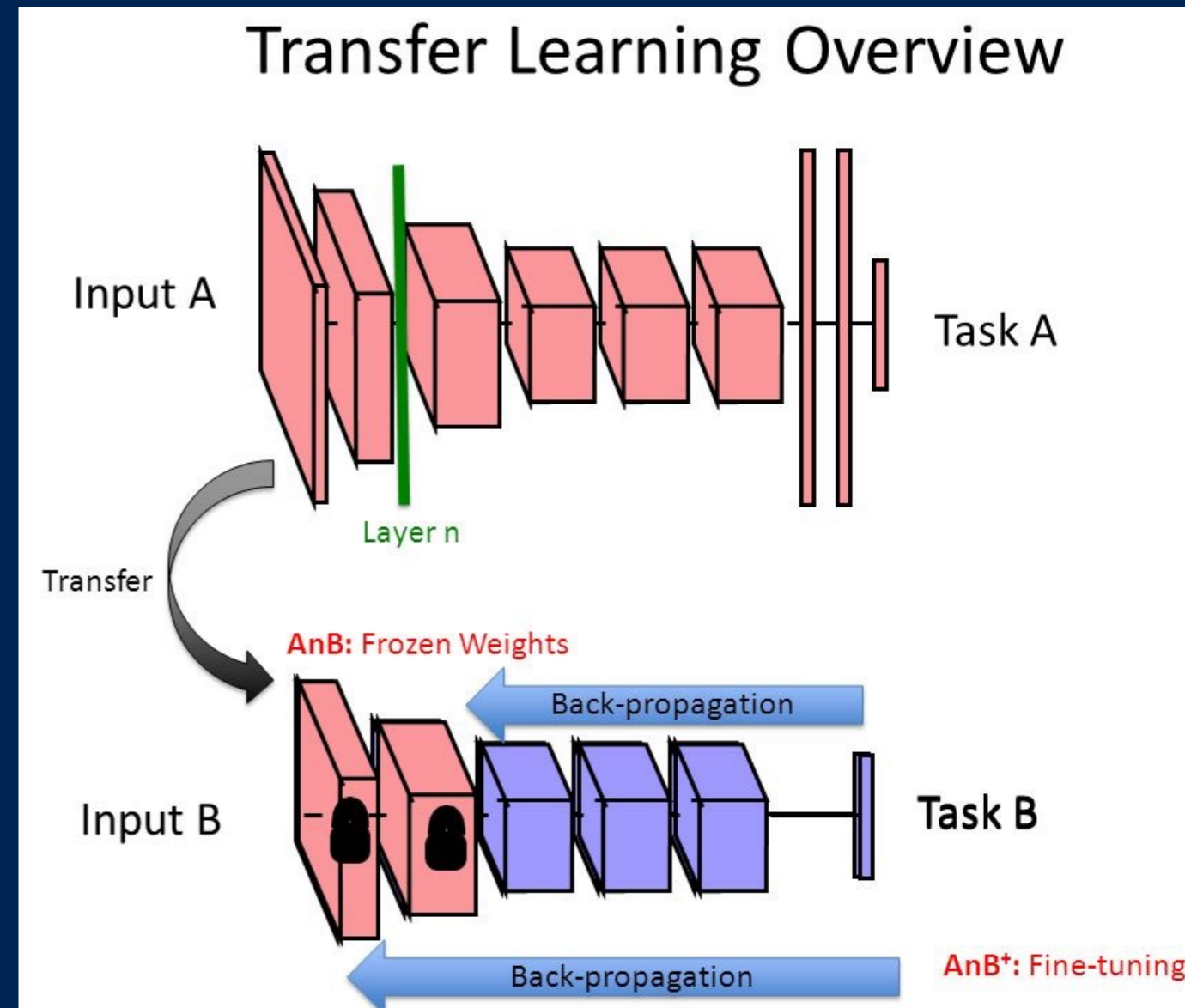
- **what problem are we trying to solve?**
- **why are we trying to solve it?**
- **what data do we have?**
- **what does a right answer look like?**

data

- **more data makes most machine learning problems easier**
- **augmentation**
- **one-off solutions to get more data**
- **get creative and don't do things right**

model retraining

- **let's not rebuild our model from scratch!**
- **can reuse existing model**
- **re-run training on part of model with new data set**



prepare your mind



image recognition

- **2017: basic nn, vgg, inception, resnet, mobilenets**
- **2018: densenet, wide resnet, darknet, nasnet, amoebanet**
- **2018 mobile: squeezenet, shufflenet, nasnet mobile, mobilenets v2**

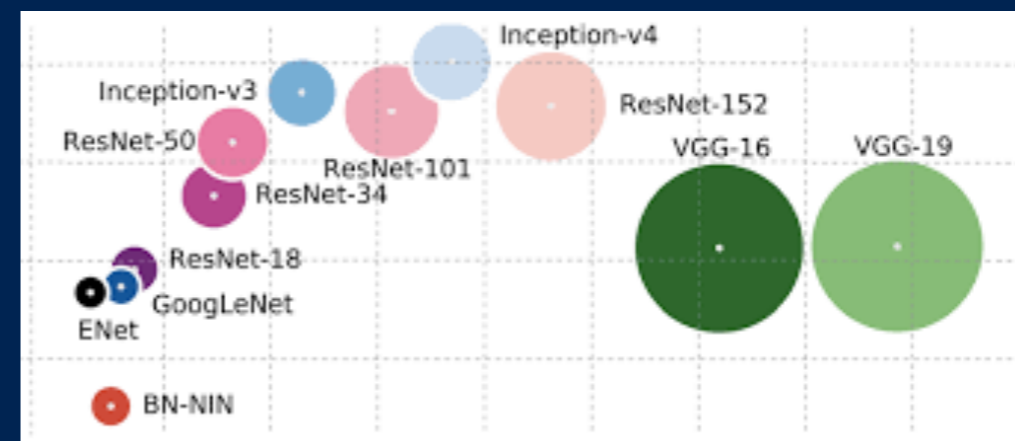
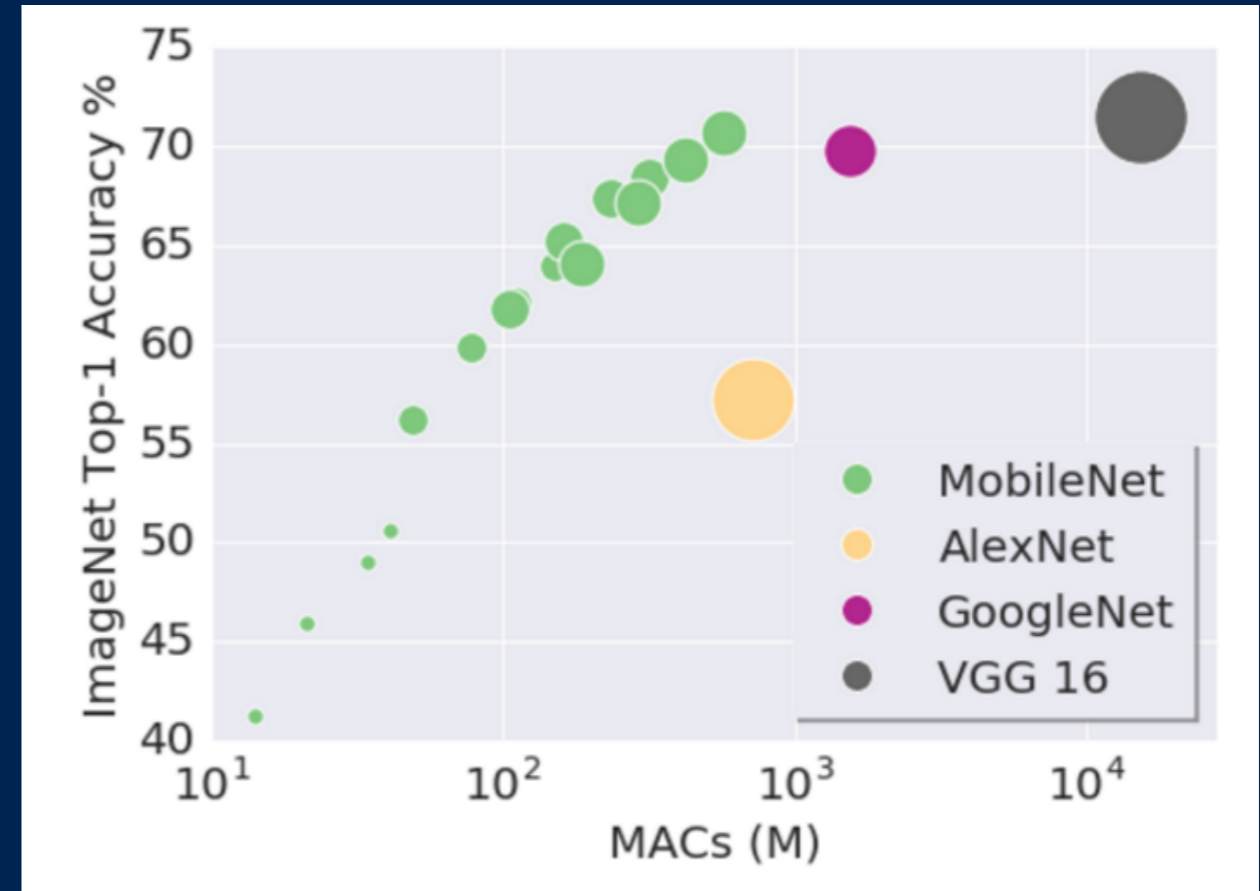
resnet

- residual networks
- skip connections
- even deeper training
- turicreate resnet demo



mobilenets

- **depthwise separable convolutions**
- **announced april 17, paper, demo**
- **tf-lite demo**
- **february 18: v2**



object detection

- **yolo, yolo 9k, yolo v3**
- **vgg + ssd, resnet + ssd + retinanet**
- **mobilenets + ssd + tensorflow demo**
- **turicreate + yolo demo**
- **gcp + tensorflow for swift demo**

style transfer

- **paper**
- **coursera example**
- **fast.ai example**
- **pytorch + onnx + coreml demo**
- **tensorflow android demo**

super resolution

- **paper**
- **japan demo**
- **pytorch onnx demo**

contenders

PYTHON



R



JAVA



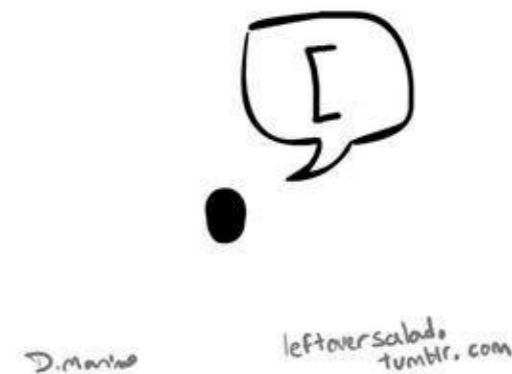
JAVASCRIPT



HASKELL



BRAINFUCK



tensorflow + js

- **tensorflow dev summit**
- **talk online shortly**
- **fun stuff**
- **keras bridge**

tensorflow + swift

- **potentially future of language/etc**
- **lattner + google → cool stuff**
- **tpu demo**

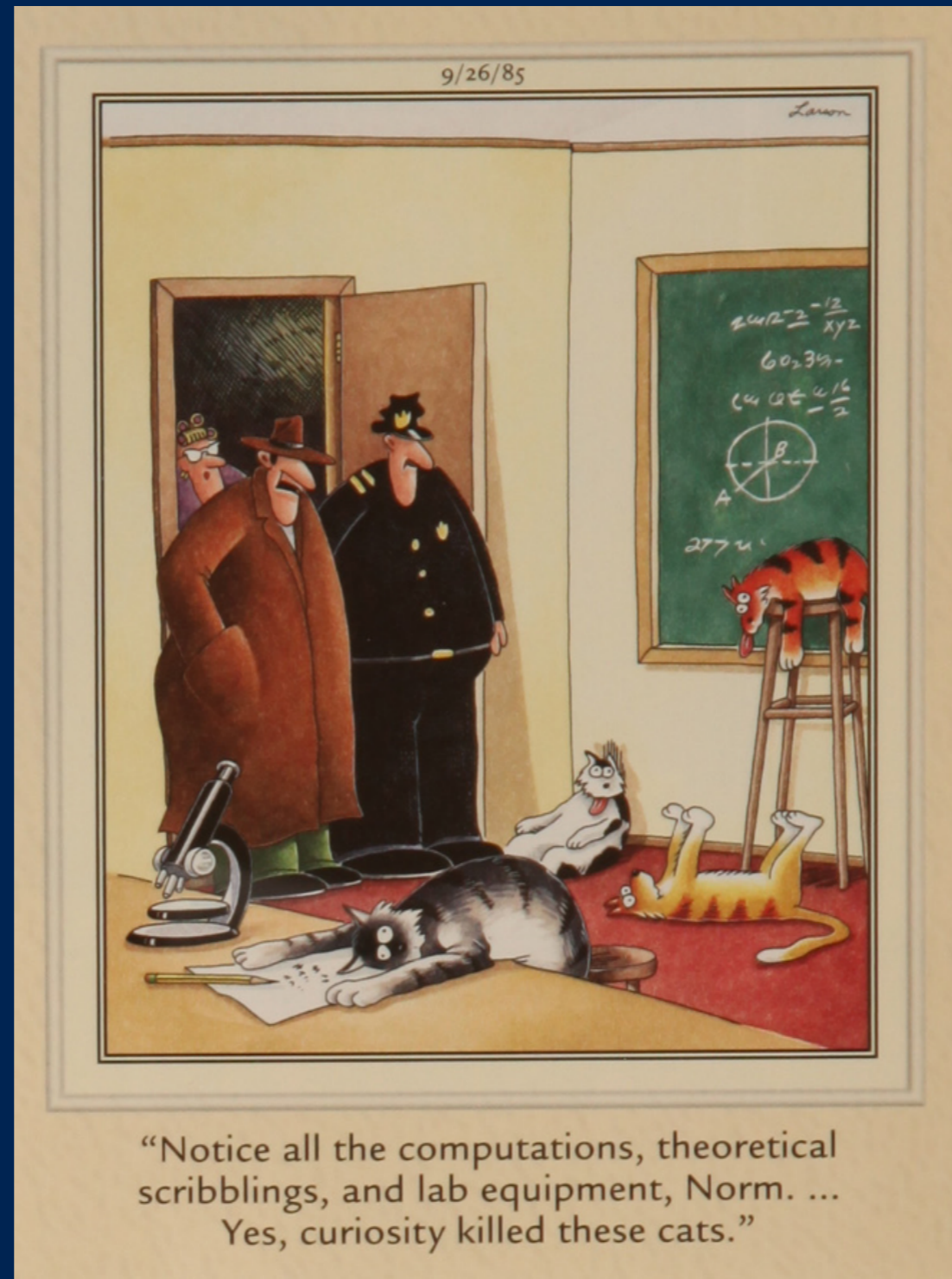
caffe

- **potentially future of language/etc**
- **facebook backing**
- **coming soon**
- **api compatible with pytorch**

firebase + mlkit

- **hybrid client/server approach**
- **build tf-lite model, upload to cloud, run on device**

look to the wind



create ml

- **apple wrapping the whole enchilada**
- **drinking the ocean**

tensor comprehensions

- **multi gpu programming sucks**
- **need hard-typed language to make assumptions**
- **use complete graph model → build hardware dsl for operations**

off the beaten path

- **audio/video segmentation**
- **language models**
- **gans**
- **game theory**
- **...**