convolutional neural networks, swift and iOS 11

> by brett koonce august 10th, 2017

overview

- goal: image recognition on mobile device
- machine learning, neural networks, demo: keras + tensorflow + coreml
- convolutional neural networks, different models, training/production improvements
- shiny things to play with

machine learning



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



| | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | |
|----------|---|---|---|---|---|---|----|----|----|----|---|---|---|---|--|
| | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | |
| | 0 | 0 | 0 | 0 | 0 | 0 | .6 | .8 | 0 | 0 | 0 | 0 | 0 | 0 | |
| | 0 | 0 | 0 | 0 | 0 | 0 | .7 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | |
| | 0 | 0 | 0 | 0 | 0 | 0 | .7 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | |
| | 0 | 0 | 0 | 0 | 0 | 0 | .5 | 1 | .4 | 0 | 0 | 0 | 0 | 0 | |
| \smile | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | .4 | 0 | 0 | 0 | 0 | 0 | |
| _ | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | .4 | 0 | 0 | 0 | 0 | 0 | |
| | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | .7 | 0 | 0 | 0 | 0 | 0 | |
| | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 1 | 0 | 0 | 0 | 0 | 0 | |
| | 0 | 0 | 0 | 0 | 0 | 0 | 0 | .9 | 1 | .1 | 0 | 0 | 0 | 0 | |
| | 0 | 0 | 0 | 0 | 0 | 0 | 0 | .3 | 1 | .1 | 0 | 0 | 0 | 0 | |
| | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | |
| | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | |





nn: activation layer

- [input] => [FC] => [FC] => [0-9]
- hidden layer



mnist demo

- goal: mnist recognition on device
- neural network: keras
- model training: tensorflow
- deploy model: coreml
- github.com/asparagui/keras_mnist_demo

convolutional neural networks



convolutions

convolution == matrix math == a[x] + b

| 1/16 | 1/8 | 1/16 | | | |
|------|-----|------|--|--|--|
| 1/8 | 1/4 | 1/8 | | | |
| 1/16 | 1/8 | 1/16 | | | |









conv: 3x3 striding

- break up input image into chunks
- <u>cs231n.github.io</u>

deepfish



convi maxpool

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



combined: vggnet







- state of art 2014
- github.com/hollance/forge
- demo running on phone (forge/metal)
- prior model + 512MB of weights
- works, but slow!

improvements

- different models (architecture)
- different training methods (speed)
- how is code actually executed? (hardware)
- what are our expectations?

going deeper



inception node

parallel execution, 1x1 convolution



 iamaaditya.github.io/2016/03/one-by-oneconvolution/

inception graph



Going Deeper with Convolutions

Christian Szegedy, Wei Liu, Yangqing Jia, Pierre Sermanet, Scott Reed, Dragomir Anguelov, Dumitru Erhan, Vincent Vanhoucke, Andrew Rabinovich

ArXiv 2014, CVPR 2015



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

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



model optimization

- retrain an inception v3 graph model
- prune (remove extra nodes)
- reduce (combine nodes)
- quantize (double -> int)
- align (mmap result)

inception demo

- all of the above
- tensorflow for mobile poets (warden)
- live video => image recognition
- state of the art 2016
- tensorflow library, ios/android

next steps



"Notice all the computations, theoretical scribblings, and lab equipment, Norm. ... Yes, curiosity killed these cats."

resnet

- residual networks
- skip layers
- even deeper training
- demo



mobilenets

- depthwise separable convolutions
- announced april, paper, demo
- modify inception retrain script
 - --architecture mobilenet_1.0_224





other models

- object detection:
 - YOLO (+demo)
 - SSD, SLAM, R-CNN
- see also: random forests, svm
- caffe model zoo!

thanks for coming!

questions

- me: <u>brettkoonce.com</u>
- apps: <u>quarkworks.net</u>
- tensorflow for mobile poets
- github.com/hollance/forge
- lab: <u>cell.missouri.edu</u>