GTSRB <u>http://benchmark.ini.rub.de/?section=gtsrb&subsection=news</u> Der letzte Führerscheinneuling ist schon geboren!

Setup

Dataset: German Traffic Sign Recognition Benchmark Training Images: 39'254 / Testing Images: 12'630

Environment:



Multi-Class, Single Image Classification with CNNs using KERAS

Challenges

- Amount of data to process (processing time)
- Image alignment
- Compatibility of open source packages

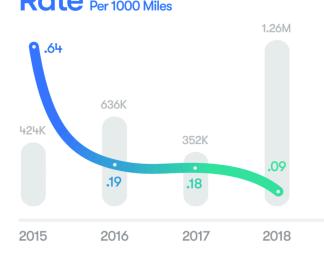
Lessons learned

- ✓ Make Use of H5 Files to save data and trained models
 ✓ Decide what to do local and what in the cloud (load h5 files with data => local / train model => cloud)
 ✓ Amount of training data is critical to success
- ✓ Proper infrastructure is a must (CPU/GPU etc.)
- ✓ Dealing with open source packages can be a pain (version compatibility)



Waymo One's on-demand autonomous rides come with human backup for now.

Waymo Disengagement Rate Per 1000 Miles



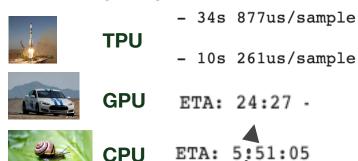


Test Image Samples





Zeit pro Epoche



Prepare Training Images

- Random Load Image/Label from G Drive
 - PreProcess Images
- Histogram Normalization / Rescale etc.
- Store in H5 file for later use

Create Model (BM)

• Sequential

- 6 convolutional layer with ReLU activation
- Use of MaxPooling & DropOut in between
- 1 fully connected hidden layer
- Optimizer: Stochastic gradient descent (SGD)
 + Nesterov enabled
- Loss Function: categorical_crossentropy
 - Goal: Accuracy

| | • | | | | | | | | | |
|-------|----------|-------|----|---|------|------|------|-----|-----|-----|
| Test | accuracy | = | 0. | 9 | 7719 | 7149 | 9643 | 705 | 54 | т |
| Prodi | at Tabal | r 1 6 | | 1 | 20 | | /1 | 7 | 1 (| 0 1 |

Slightly manipulate original images on the fly

TestLabel [16 1 38 ... 6 7 10]

Improve Model (IM) & Train again

Using Keras built-in data augmentation features (ImageDataGenerator) to increase

Explodes Training Data and training =>

amount of training data

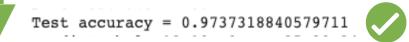
| Layer (type) | Output Shape | | | | Param # | |
|------------------------------|--------------|-----|-----|-----|---------|--|
| conv2d_1 (Conv2D) | (None, | 32, | 48, | 48) | 896 | |
| conv2d_2 (Conv2D) | (None, | 32, | 46, | 46) | 9248 | |
| max_pooling2d_1 (MaxPooling2 | (None, | 32, | 23, | 23) | 0 | |
| dropout_1 (Dropout) | (None, | 32, | 23, | 23) | 0 | |

Train Model (BM)

- Load H5 file with training images
- Train with batch size 32 over 30 epochs
- Use ModelCheckPoint to save best as H5 file

Score Model

- Load trained Model from H5 file
- Load test Images from H5 file
- Score Model



| conv2d_3 (Conv2D) | (None, | 64, 23, 23) | 18496 |
|--|--------|--------------|---------|
| conv2d_4 (Conv2D) | (None, | 64, 21, 21) | 36928 |
| max_pooling2d_2 (MaxPooling2 | (None, | 64, 10, 10) | 0 |
| dropout_2 (Dropout) | (None, | 64, 10, 10) | 0 |
| conv2d_5 (Conv2D) | (None, | 128, 10, 10) | 73856 |
| conv2d_6 (Conv2D) | (None, | 128, 8, 8) | 147584 |
| max_pooling2d_3 (MaxPooling2 | (None, | 128, 4, 4) | 0 |
| dropout_3 (Dropout) | (None, | 128, 4, 4) | 0 |
| flatten_1 (Flatten) | (None, | 2048) | 0 |
| dense_1 (Dense) | (None, | 512) | 1049088 |
| dropout_4 (Dropout) | (None, | 512) | 0 |
| dense_2 (Dense) | (None, | 43) | 22059 |
| Total params: 1,358,155 Trainable params: 1,358,155 | | | |

Non-trainable params: 0