

# Media Informatic Systems

## Image recognition task

Carlos Sánchez Páez

7<sup>th</sup> December 2018

# Index

Description of the task

Dataset

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Description of the task
- 2 Dataset
- 3 Preprocessing
- 4 Structure of the net
- 5 Neural network development
- 6 Final results
- 7 Examples

# Index

Description of the task

Dataset

Preprocessing

Structure of the net

Neural network development

Final results

Examples

1 Description of the task

2 Dataset

3 Preprocessing

4 Structure of the net

5 Neural network development

6 Final results

7 Examples

# Description of the task

Description of the task

Datasets

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Convolutional neural network.
- 2 Keras framework with TensorFlow backend.
- 3 Python 3.6.
- 4 NVIDIA 960M GPU (1 505 GFLOPS).



# Index

Description of the task

**Dataset**

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Description of the task
- 2 Dataset**
- 3 Preprocessing
- 4 Structure of the net
- 5 Neural network development
- 6 Final results
- 7 Examples

# CIFAR100

Description of the task

**Dataset**

Preprocessing

Structure of the net

Neural network development

Final results

Examples

① 60 000 32x32 colour images (RGB).

# CIFAR100

Description of the task

**Dataset**

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 60 000 32x32 colour images (RGB).
- 2 100 classes.

# CIFAR100

Description of the task

**Dataset**

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 60 000 32x32 colour images (RGB).
- 2 100 classes.
- 3 600 images per class.



# CIFAR100

Description of the task

**Dataset**

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- ① 60 000 32x32 colour images (RGB).
- ② 100 classes.
- ③ 600 images per class.
  - ① 500 training.

# CIFAR100

Description of the task

**Dataset**

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- ① 60 000 32x32 colour images (RGB).
- ② 100 classes.
- ③ 600 images per class.
  - ① 500 training.
  - ② 100 testing.

# CIFAR100

Description of the task

**Dataset**

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- ① 60 000 32x32 colour images (RGB).
- ② 100 classes.
- ③ 600 images per class.
  - ① 500 training.
  - ② 100 testing.
- ④ Best accuracy: 75.72%

# Classes in the dataset

Description of the task

Dataset

Preprocessing

Structure of the net

Neural network development

Final results

Examples

aquatic mammals	beaver, dolphin, otter, seal, whale
fish	aquarium fish, flatfish, ray, shark, trout
flowers	orchids, poppies, roses, sunflowers, tulips
food containers	bottles, bowls, cans, cups, plates
fruit and vegetables	apples, mushrooms, oranges, pears, sweet peppers
household electrical devices	clock, computer keyboard, lamp, telephone, television
household furniture	bed, chair, couch, table, wardrobe
insects	bee, beetle, butterfly, caterpillar, cockroach
large carnivores	bear, leopard, lion, tiger, wolf
large man-made outdoor things	bridge, castle, house, road, skyscraper
large natural outdoor scenes	cloud, forest, mountain, plain, sea
large omnivores and herbivores	camel, cattle, chimpanzee, elephant, kangaroo
medium-sized mammals	fox, porcupine, possum, raccoon, skunk
non-insect invertebrates	crab, lobster, snail, spider, worm
people	baby, boy, girl, man, woman
reptiles	crocodile, dinosaur, lizard, snake, turtle
small mammals	hamster, mouse, rabbit, shrew, squirrel
trees	maple, oak, palm, pine, willow
vehicles 1	bicycle, bus, motorcycle, pickup truck, train
vehicles 2	lawn-mower, rocket, streetcar, tank, tractor

# Index

Description of the task

Dataset

**Preprocessing**

Structure of the net

Neural network development

Final results

Examples

- 1 Description of the task
- 2 Dataset
- 3 Preprocessing**
- 4 Structure of the net
- 5 Neural network development
- 6 Final results
- 7 Examples

# Preprocessing (I)

Description of the task

Datasets

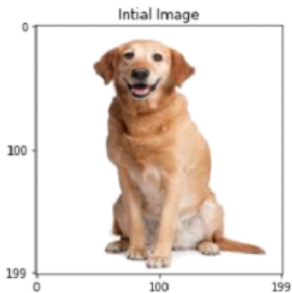
**Preprocessing**

Structure of the net

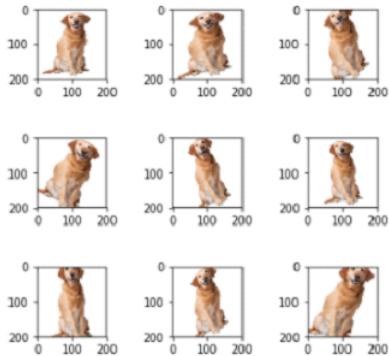
Neural network development

Final results

Examples



Augmented Images



# Preprocessing (II)

Description of the task

Datasets

Preprocessing

Structure of the net

Neural network development

Final results

Examples

```
datagen = ImageDataGenerator(  
    featurewise_center=False,  
    samplewise_center=False,  
    featurewise_std_normalization=False,  
    samplewise_std_normalization=False,  
    zca_whitening=False,  
    rotation_range=0,  
    width_shift_range=0.1,  
    height_shift_range=0.1,  
    horizontal_flip=True,  
    vertical_flip=True)
```

# Index

Description of the task

Dataset

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Description of the task
- 2 Dataset
- 3 Preprocessing
- 4 Structure of the net**
- 5 Neural network development
- 6 Final results
- 7 Examples



# Structure of the net (I)

Description of the task

Dataset

Preprocessing

Structure of the net

Neural network development

Final results

Examples

## ① Convolutional layer (128 filters)

# Structure of the net (I)

Description of the task

Dataset

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Convolutional layer (128 filters)
- 2 Convolutional layer (128 filters)

# Structure of the net (I)

Description of the task

Dataset

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Convolutional layer (128 filters)
- 2 Convolutional layer (128 filters)
- 3 Max Pooling layer (2x2)

# Structure of the net (I)

Description of the task

Dataset

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Convolutional layer (128 filters)
- 2 Convolutional layer (128 filters)
- 3 Max Pooling layer (2x2)
- 4 Dropout layer

# Structure of the net (I)

Description of the task

Dataset

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Convolutional layer (128 filters)
- 2 Convolutional layer (128 filters)
- 3 Max Pooling layer (2x2)
- 4 Dropout layer
- 5 Convolutional layer (256 filters)

# Structure of the net (I)

Description of the task

Datasets

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Convolutional layer (128 filters)
- 2 Convolutional layer (128 filters)
- 3 Max Pooling layer (2x2)
- 4 Dropout layer
- 5 Convolutional layer (256 filters)
- 6 Convolutional layer (256 filters)

# Structure of the net (I)

Description of the task

Datasets

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Convolutional layer (128 filters)
- 2 Convolutional layer (128 filters)
- 3 Max Pooling layer (2x2)
- 4 Dropout layer
- 5 Convolutional layer (256 filters)
- 6 Convolutional layer (256 filters)
- 7 Max Pooling layer (2x2)

# Structure of the net (I)

Description of the task

Datasets

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Convolutional layer (128 filters)
- 2 Convolutional layer (128 filters)
- 3 Max Pooling layer (2x2)
- 4 Dropout layer
- 5 Convolutional layer (256 filters)
- 6 Convolutional layer (256 filters)
- 7 Max Pooling layer (2x2)
- 8 Dropout layer



# Structure of the net (I)

Description of the task

Datasets

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Convolutional layer (128 filters)
- 2 Convolutional layer (128 filters)
- 3 Max Pooling layer (2x2)
- 4 Dropout layer
- 5 Convolutional layer (256 filters)
- 6 Convolutional layer (256 filters)
- 7 Max Pooling layer (2x2)
- 8 Dropout layer
- 9 Convolutional layer (512 filters)

# Structure of the net (I)

Description of the task

Datasets

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Convolutional layer (128 filters)
- 2 Convolutional layer (128 filters)
- 3 Max Pooling layer (2x2)
- 4 Dropout layer
- 5 Convolutional layer (256 filters)
- 6 Convolutional layer (256 filters)
- 7 Max Pooling layer (2x2)
- 8 Dropout layer
- 9 Convolutional layer (512 filters)
- 10 Convolutional layer (512 filters)

# Structure of the net (I)

Description of the task

Datasets

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Convolutional layer (128 filters)
- 2 Convolutional layer (128 filters)
- 3 Max Pooling layer (2x2)
- 4 Dropout layer
- 5 Convolutional layer (256 filters)
- 6 Convolutional layer (256 filters)
- 7 Max Pooling layer (2x2)
- 8 Dropout layer
- 9 Convolutional layer (512 filters)
- 10 Convolutional layer (512 filters)
- 11 Max Pooling layer (2x2)

# Structure of the net (I)

Description of the task

Datasets

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- ① Convolutional layer (128 filters)
- ② Convolutional layer (128 filters)
- ③ Max Pooling layer (2x2)
- ④ Dropout layer
- ⑤ Convolutional layer (256 filters)
- ⑥ Convolutional layer (256 filters)
- ⑦ Max Pooling layer (2x2)
- ⑧ Dropout layer
- ⑨ Convolutional layer (512 filters)
- ⑩ Convolutional layer (512 filters)
- ⑪ Max Pooling layer (2x2)
- ⑫ Dropout layer

# Structure of the net (I)

Description of the task

Datasets

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- ① Convolutional layer (128 filters)
- ② Convolutional layer (128 filters)
- ③ Max Pooling layer (2x2)
- ④ Dropout layer
- ⑤ Convolutional layer (256 filters)
- ⑥ Convolutional layer (256 filters)
- ⑦ Max Pooling layer (2x2)
- ⑧ Dropout layer
- ⑨ Convolutional layer (512 filters)
- ⑩ Convolutional layer (512 filters)
- ⑪ Max Pooling layer (2x2)
- ⑫ Dropout layer
- ⑬ Flatten layer

# Structure of the net (I)

Description of the task

Dataset

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Convolutional layer (128 filters)
- 2 Convolutional layer (128 filters)
- 3 Max Pooling layer (2x2)
- 4 Dropout layer
- 5 Convolutional layer (256 filters)
- 6 Convolutional layer (256 filters)
- 7 Max Pooling layer (2x2)
- 8 Dropout layer
- 9 Convolutional layer (512 filters)
- 10 Convolutional layer (512 filters)
- 11 Max Pooling layer (2x2)
- 12 Dropout layer
- 13 Flatten layer
- 14 Fully connected layer (1024 neurons)

# Structure of the net (I)

Description of the task

Dataset

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Convolutional layer (128 filters)
- 2 Convolutional layer (128 filters)
- 3 Max Pooling layer (2x2)
- 4 Dropout layer
- 5 Convolutional layer (256 filters)
- 6 Convolutional layer (256 filters)
- 7 Max Pooling layer (2x2)
- 8 Dropout layer
- 9 Convolutional layer (512 filters)
- 10 Convolutional layer (512 filters)
- 11 Max Pooling layer (2x2)
- 12 Dropout layer
- 13 Flatten layer
- 14 Fully connected layer (1024 neurons)
- 15 Dropout layer

# Structure of the net (I)

Description of the task

Dataset

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- ① Convolutional layer (128 filters)
- ② Convolutional layer (128 filters)
- ③ Max Pooling layer (2x2)
- ④ Dropout layer
- ⑤ Convolutional layer (256 filters)
- ⑥ Convolutional layer (256 filters)
- ⑦ Max Pooling layer (2x2)
- ⑧ Dropout layer
- ⑨ Convolutional layer (512 filters)
- ⑩ Convolutional layer (512 filters)
- ⑪ Max Pooling layer (2x2)
- ⑫ Dropout layer
- ⑬ Flatten layer
- ⑭ Fully connected layer (1024 neurons)
- ⑮ Dropout layer
- ⑯ Output layer (10 neurons)



# Structure of the net (II)

Description of the task

Datasets

Preprocessing

Structure of the net

Neural network development

Final results

Examples

```
model = Sequential()
```

```
model.add(Conv2D(128, (3, 3), padding='same',  
                 input_shape=x_train.shape[1:], activation='elu'))  
model.add(Conv2D(128, (3, 3), activation='elu'))  
model.add(MaxPooling2D(pool_size=(2, 2)))  
model.add(Dropout(0.25))
```

```
model.add(Conv2D(256, (3, 3), padding='same', activation='elu'))  
model.add(Conv2D(256, (3, 3), activation='elu'))  
model.add(MaxPooling2D(pool_size=(2, 2)))  
model.add(Dropout(0.25))
```

```
model.add(Conv2D(512, (3, 3), padding='same', activation='elu'))  
model.add(Conv2D(512, (3, 3), activation='elu'))  
model.add(MaxPooling2D(pool_size=(2, 2)))  
model.add(Dropout(0.25))
```

```
model.add(Flatten())  
model.add(Dense(1024, activation='elu'))  
model.add(Dropout(0.5))  
model.add(Dense(parameters.NUM_CLASSES, activation='softmax'))
```

# Index

Description of the task

Dataset

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- 1 Description of the task
- 2 Dataset
- 3 Preprocessing
- 4 Structure of the net
- 5 Neural network development**
- 6 Final results
- 7 Examples

# Neural network development

Description of the task

Datasets

Preprocessing

Structure of the net

Neural network development

Final results

Examples

① Calibration of parameters.

# Neural network development

Description of the task

Dataset

Preprocessing

Structure of the net

Neural network development

Final results

Examples

① Calibration of parameters.

① Learning rate.

# Neural network development

Description of the task

Dataset

Preprocessing

Structure of the net

Neural network development

Final results

Examples

## ① Calibration of parameters.

- ① Learning rate.
- ② Number of epochs.

# Neural network development

Description of the task

Datasets

Preprocessing

Structure of the net

Neural network development

Final results

Examples

## ① Calibration of parameters.

- ① Learning rate.
- ② Number of epochs.
- ③ Batch size.

# Neural network development

Description of the task

Datasets

Preprocessing

Structure of the net

Neural network development

Final results

Examples

- ① Calibration of parameters.
  - ① Learning rate.
  - ② Number of epochs.
  - ③ Batch size.
- ② Find the maximum global accuracy.

# 200 epochs training

Description of the task

Datasets

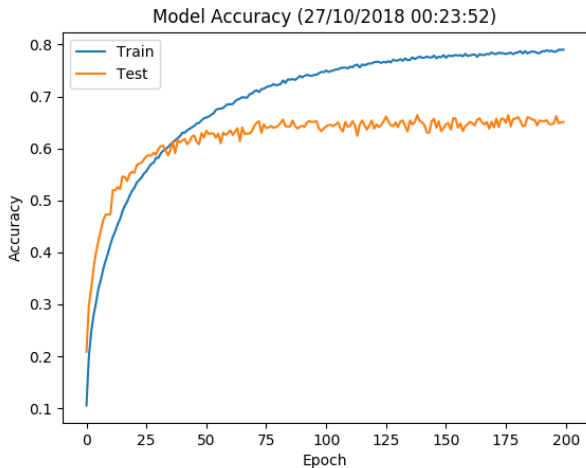
Preprocessing

Structure of the net

Neural network development

Final results

Examples





# 200 epochs training

Description of the task

Datasets

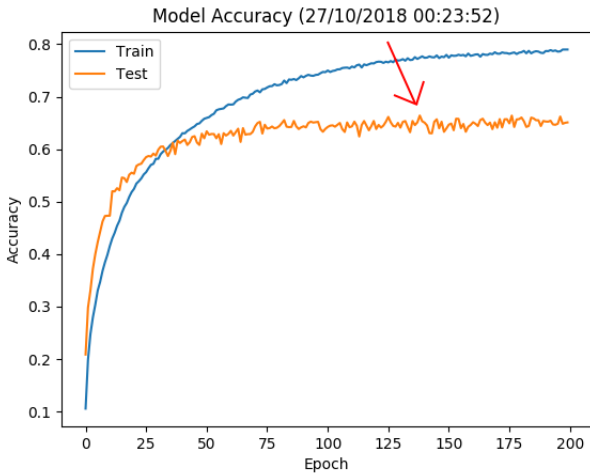
Preprocessing

Structure of the net

Neural network development

Final results

Examples



# 139 epochs training

Description of the task

Datasets

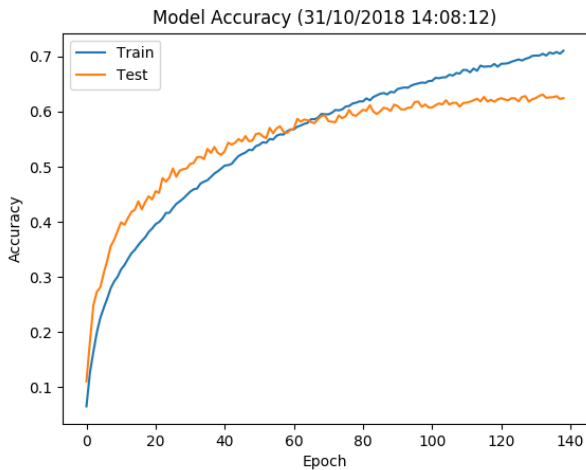
Preprocessing

Structure of the net

Neural network development

Final results

Examples



# 139 epochs training

Description of the task

Datasets

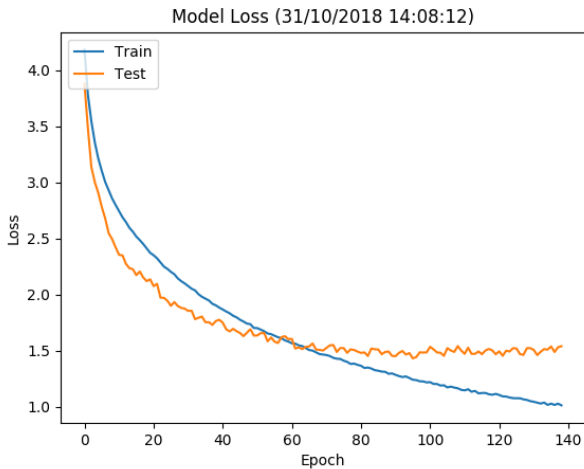
Preprocessing

Structure of the net

Neural network development

Final results

Examples



# Index

Description of the task  
Dataset  
Preprocessing  
Structure of the net  
Neural network development  
**Final results**  
Examples

- 1 Description of the task
- 2 Dataset
- 3 Preprocessing
- 4 Structure of the net
- 5 Neural network development
- 6 Final results**
- 7 Examples

# 139 epochs training

Description of the task

Dataset

Preprocessing

Structure of the net

Neural network development

**Final results**

Examples

- 1 Validation accuracy: 0.6187 %
- 2 Validation loss: 1.5597 %

# Index

Description of the task  
Dataset  
Preprocessing  
Structure of the net  
Neural network development  
Final results  
**Examples**

- 1 Description of the task
- 2 Dataset
- 3 Preprocessing
- 4 Structure of the net
- 5 Neural network development
- 6 Final results
- 7 Examples**

# Crocodile prediction

Description of the task

Dataset

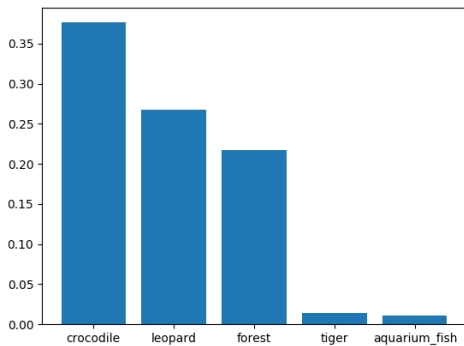
Preprocessing

Structure of the net

Neural network development

Final results

Examples



# Bee prediction

Description of the task

Dataset

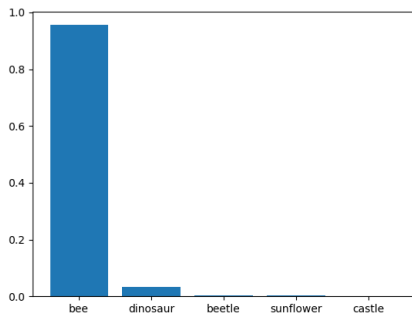
Preprocessing

Structure of the net

Neural network development

Final results

Examples





# Porcupine prediction

Description of the task

Dataset

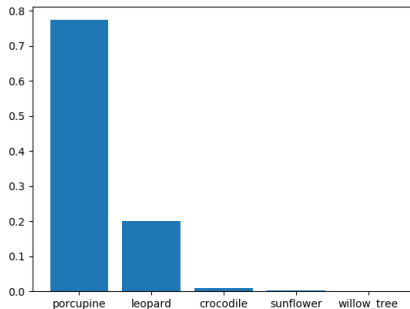
Preprocessing

Structure of the net

Neural network development

Final results

Examples



# Bear prediction

Description of the task

Dataset

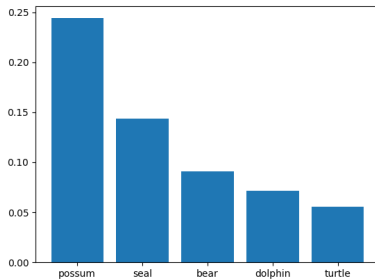
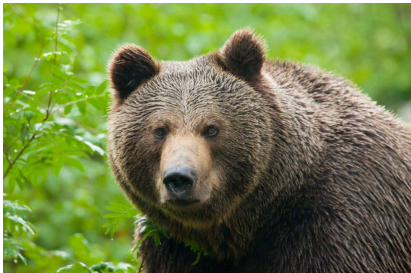
Preprocessing

Structure of the net

Neural network development

Final results

Examples



# Thanks for your attention!

Source code available at <http://www.github.com/csp98>

