

Classification of Bird Species

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Problem Statement

- Numan Bird Watch needs a robust model which can identify and classify various species of birds
- Model must be able to be trained on new data

Predicting Birds using Machine Learning



HOW CAN MACHINE LEARNING HELP
PREDICT DIFFERENT SPECIES OF BIRDS?



NEURAL NETWORKS



Dataset

Data set consist of 45980 training, 1575 validating, and 1575 testing images

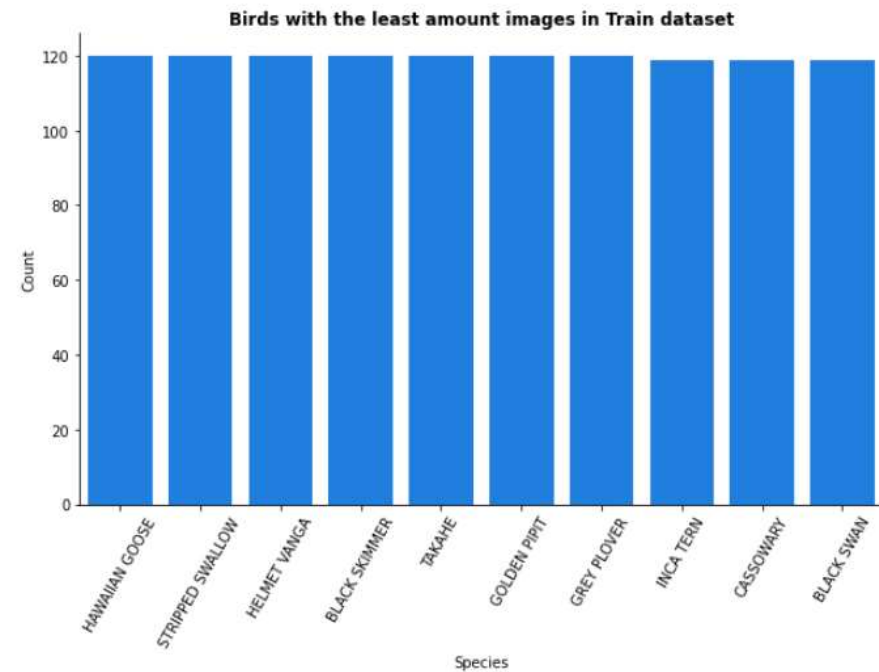
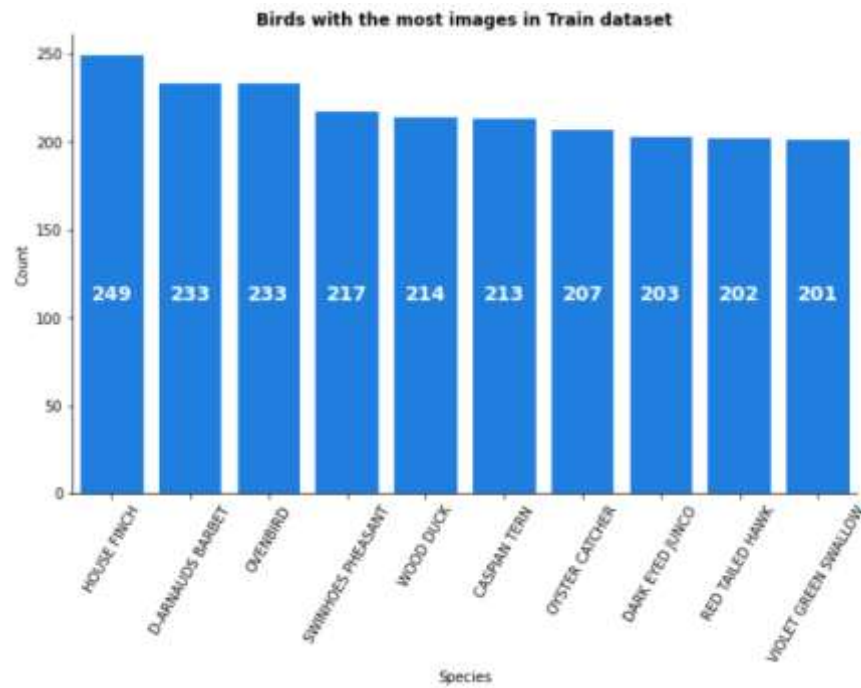
Each image is 224X224X3 in JPG

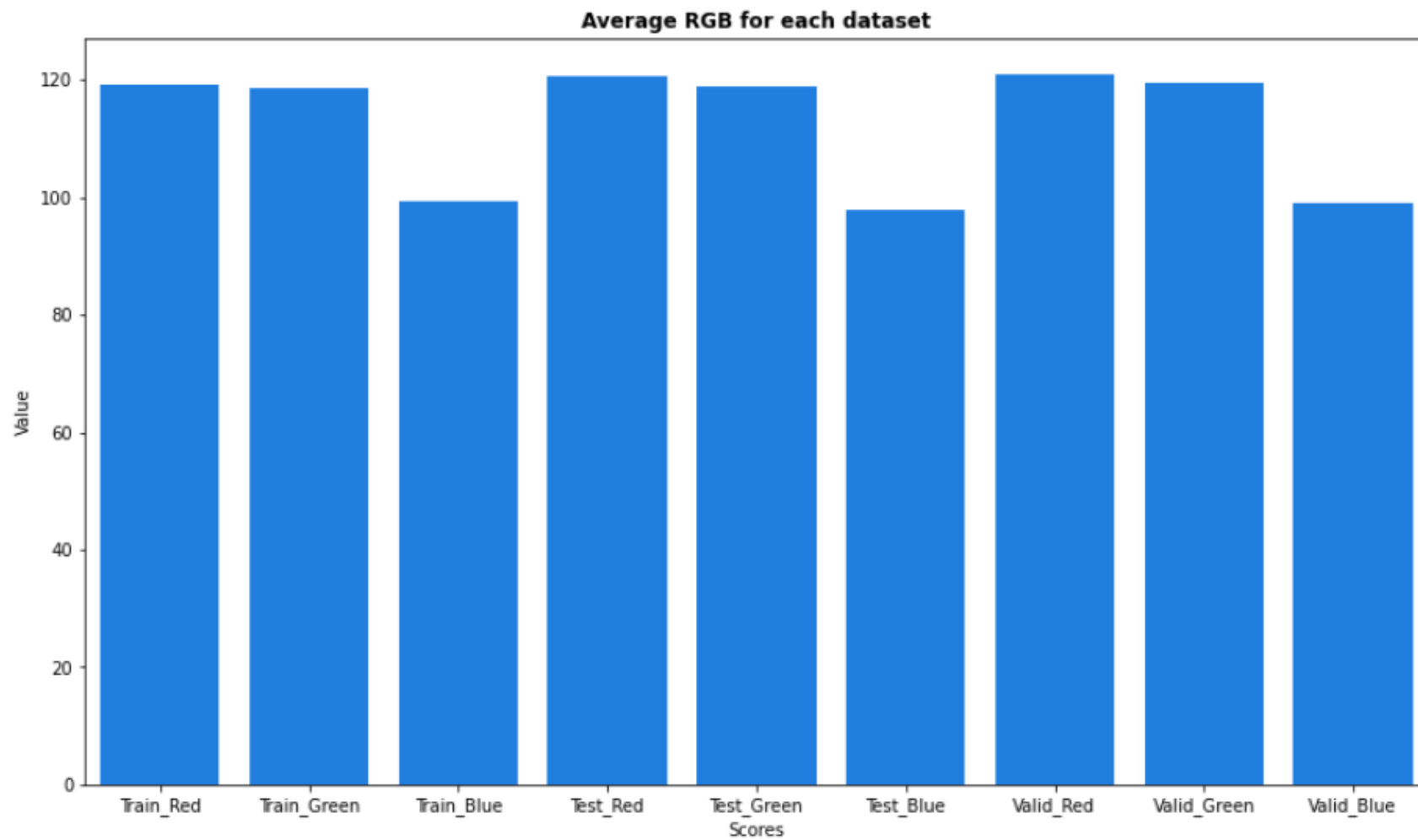
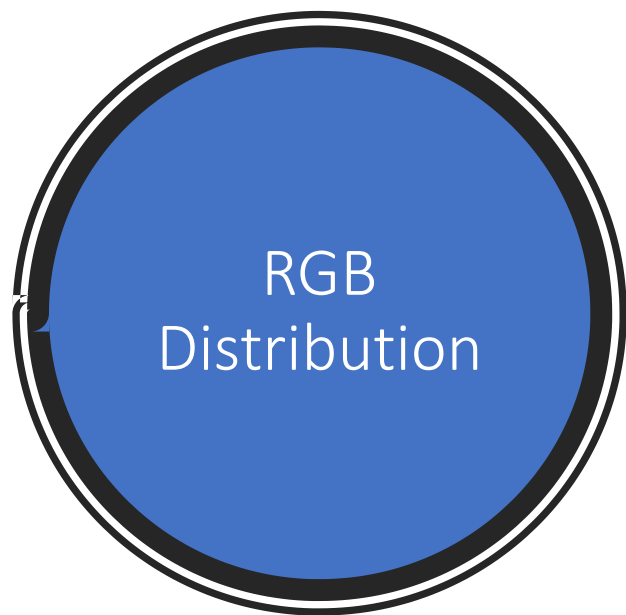
Data is clean with no anomalies and duplicates

Data set consist of 315 different species of birds

Distribution of birds

- Testing and validating set has equal number of images per bird species which is 5
- Minimum number of images for any given specie is 120







Word Cloud containing bird species names:

- NORTHERN
- WARBLER
- RED
- BLACK
- PHEASANT
- FINCH
- DUCK
- AMERICAN
- KINGFISHER
- BEARDED
- THROATED
- GOLDEN
- COMMON
- SCARLET
- CRESTED
- PURPLE
- OWL
- CROWNED
- SPARROW
- SWALLOW TAILED
- WHITE
- MAGPIE
- GREEN
- WOODPECKER
- EAGLE
- IBIS
- YELLOW

Preprocessing

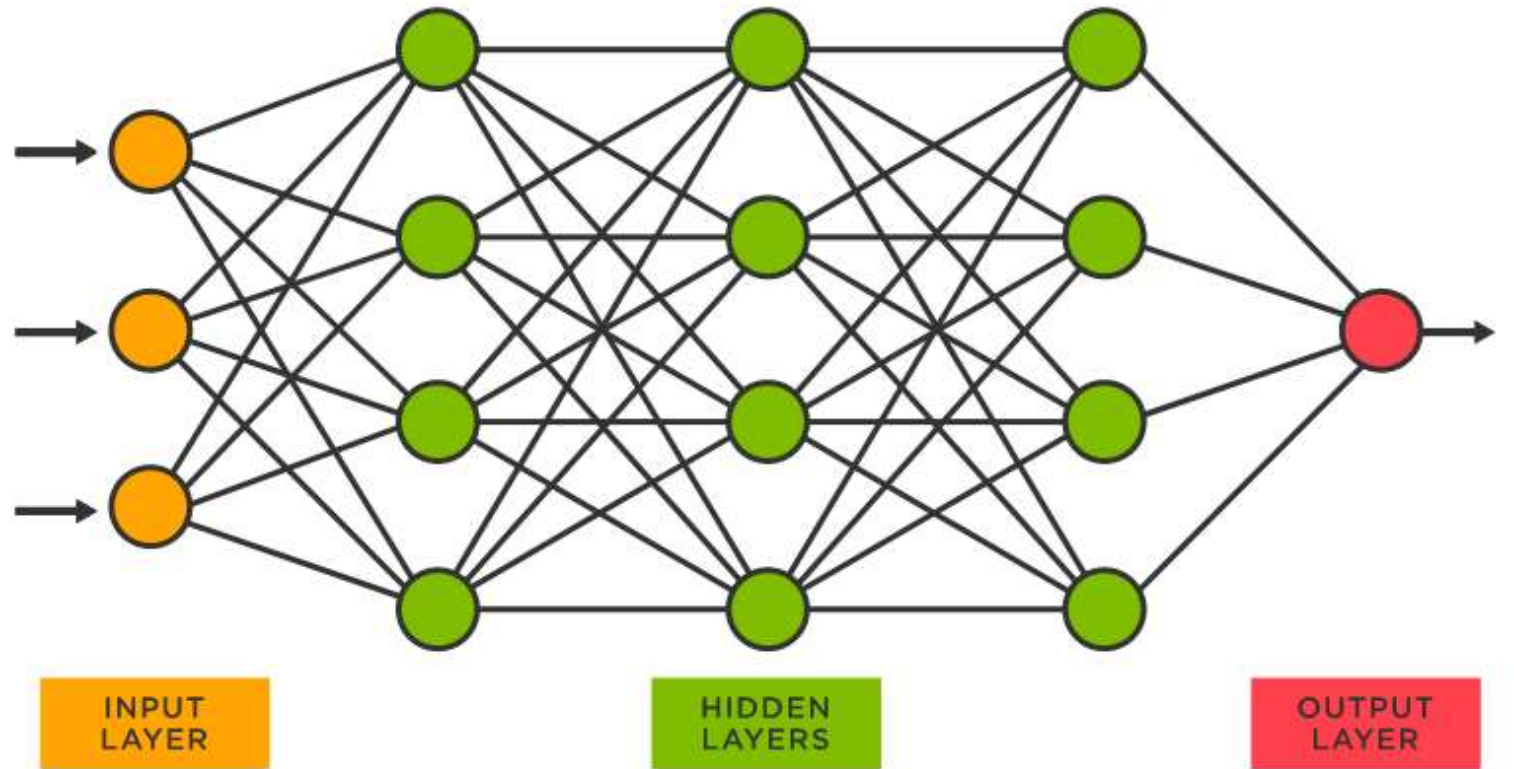
01

Rescaling data
from 224x224 to
56x56

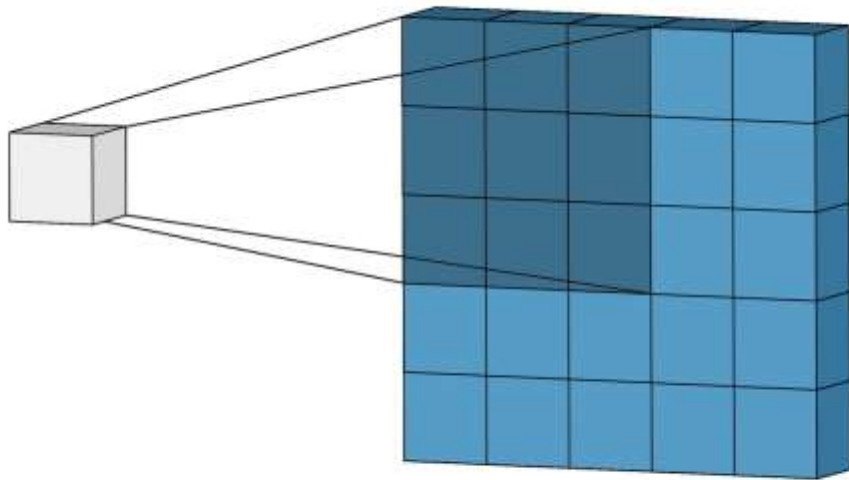
02

Normalizing data
to have a mean of
0

Neural Networks



Convolutional Neural Network



0	0	0	0	0	0	0
0	1	0	0	0	1	0
0	0	0	0	0	0	0
0	0	0	1	0	0	0
0	1	0	0	0	1	0
0	0	1	1	1	0	0
0	0	0	0	0	0	0

Input Image



0	0	1
1	0	0
0	1	1

Feature
Detector



0	1	0	0	0
0	1	1	1	0
1	0	1	2	1
1	4	2	1	0
0	0	1	2	1

Feature Map

Max Pooling

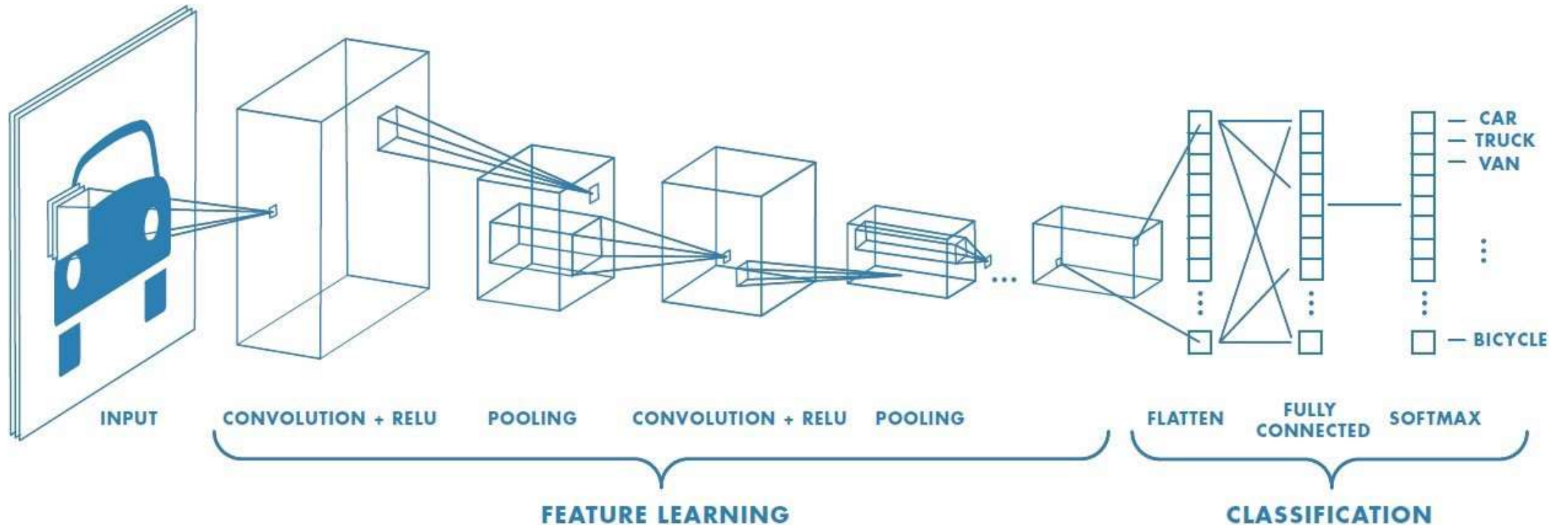
- Allows for less computation needed for training
- Highlights the most important features

2	2	7	3
9	4	6	1
8	5	2	4
3	1	2	6

Max Pool
→
Filter - (2 x 2)
Stride - (2, 2)

9	7
8	6

Fully Connected CNN



Sequential Model

- Sequential Model allows to create models layer by layer
- Conv2D
 - Filters
 - Kernel Size
 - Strides

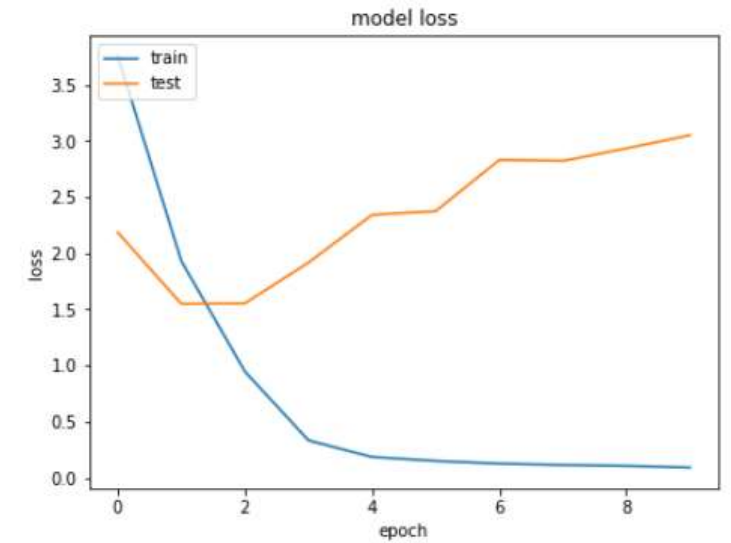
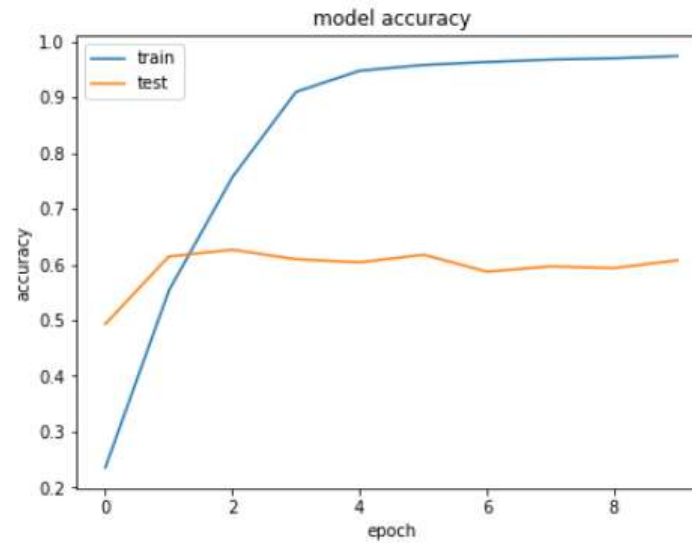
Sequential Model

- MaxPool2D
- Flatten
- Dense
- Dropout
- Optimizer
- Loss
- Metric
- Epoch



Basic Model

60% Accuracy rate



Hyperparameter Tuning

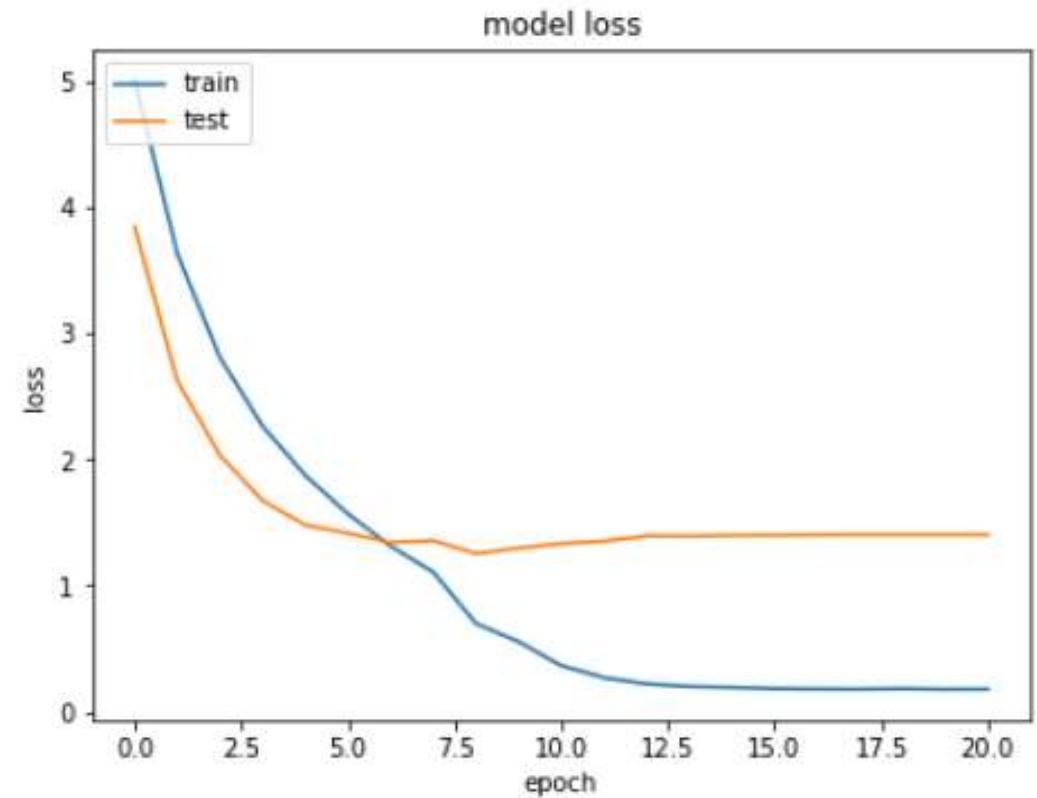
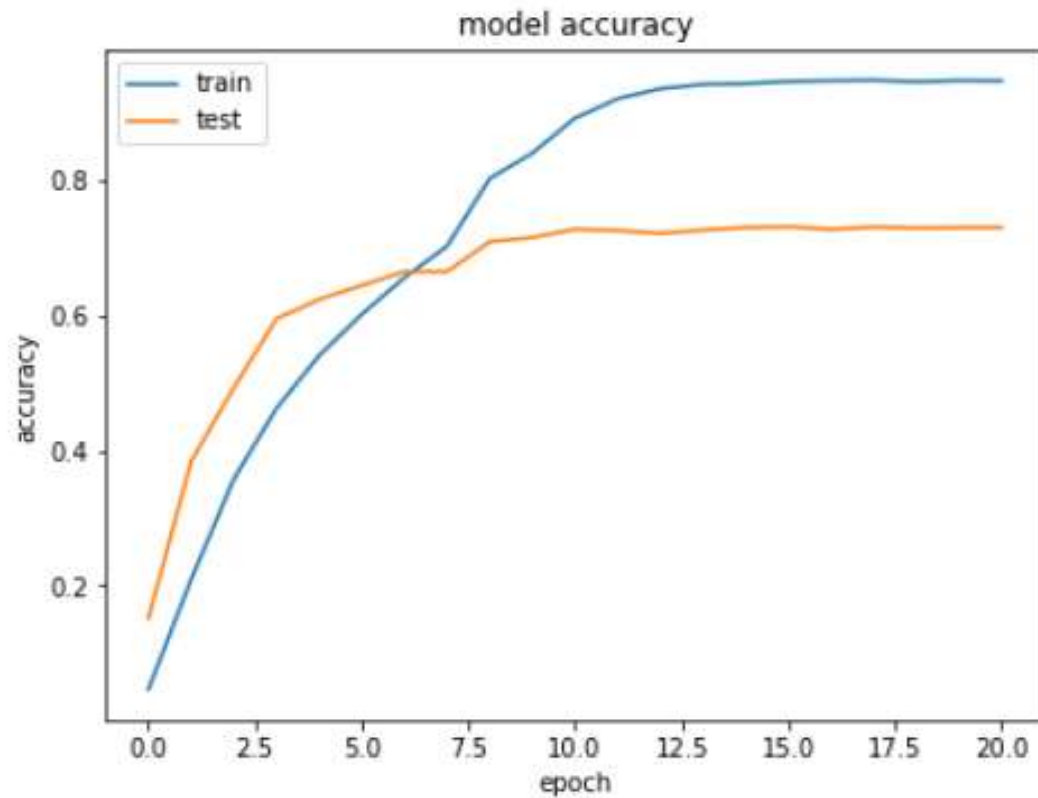
RandomSearch

Hyperband

Bayesian
Optimization

Best Model without Transfer Learning

- After Tuning achieved 73.2% accuracy score





Transfer Learning

- Transfer learning is using past models knowledge to increase the learning capabilities of new models. Pre-Trained models are models created by someone or others to solve a similar problem but rather than building a model from scratch you utilize and tweak their already built model to your own problem.

Freezing/Unfreezing Layers



Save time training models



Avoid re-learning early steps like
detecting edges and lines

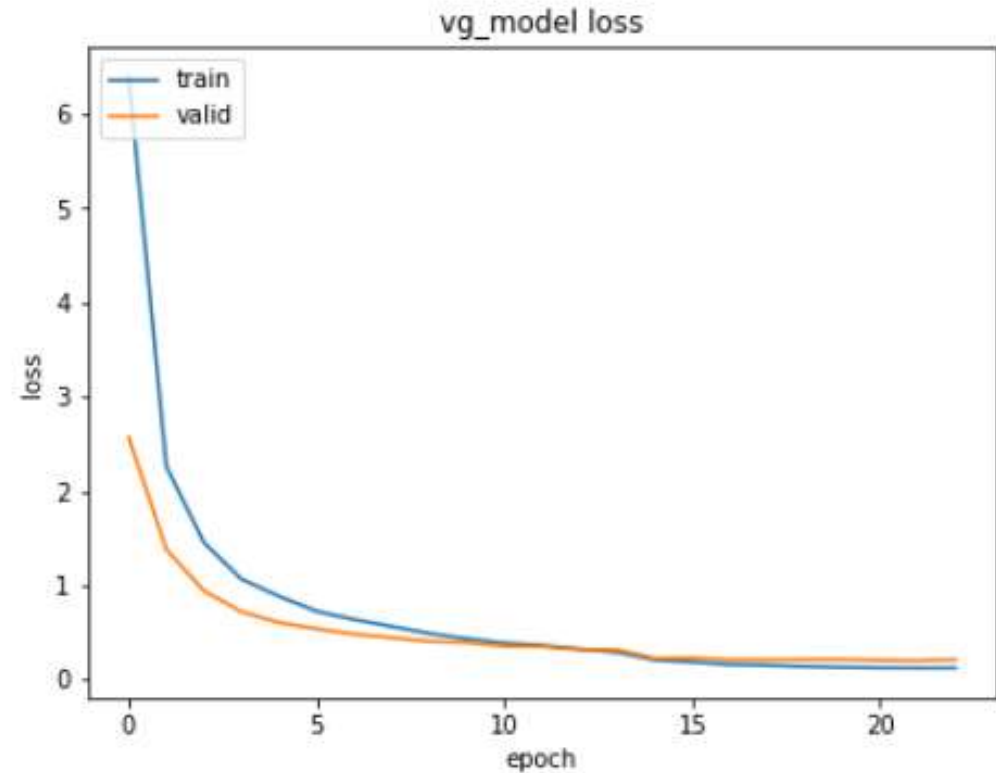
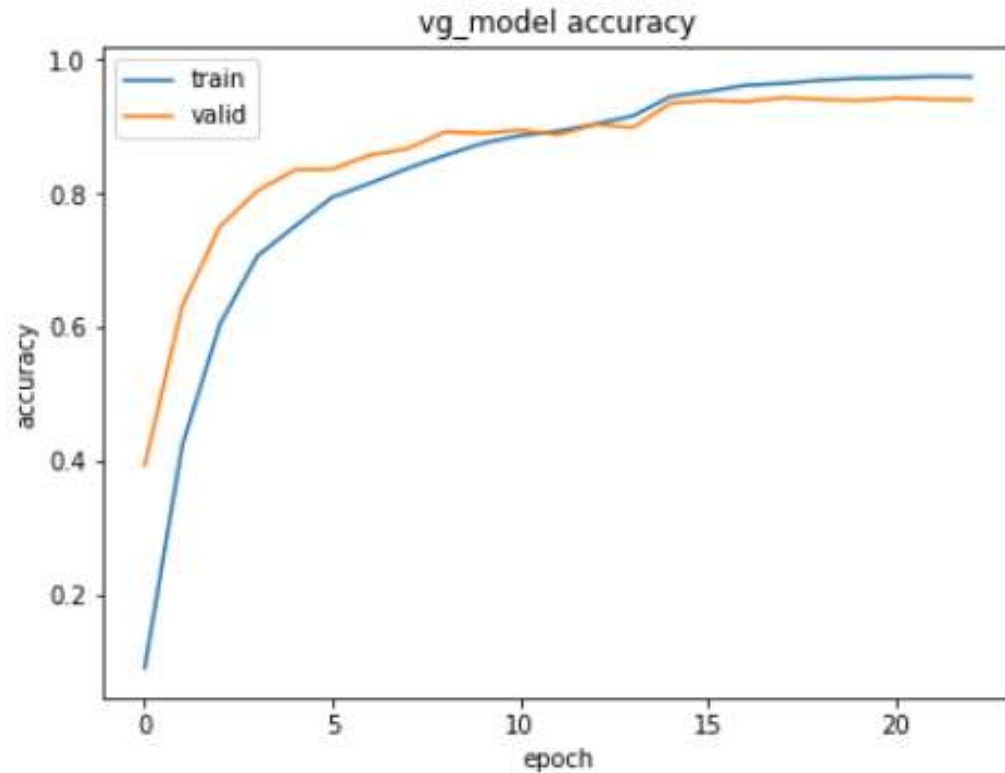
Pre-trained Models

EfficientNet - a CNN architecture where the scaling method uniformly scales the dimensions of depth, width and resolution using a compound coefficient

VGG16 - invented by the Visual Geometry Group of Oxford University and proposed by Karen Simonyan and Andrew Zisserman, it was used to win 1st place at 2014 ILSVRC challenge

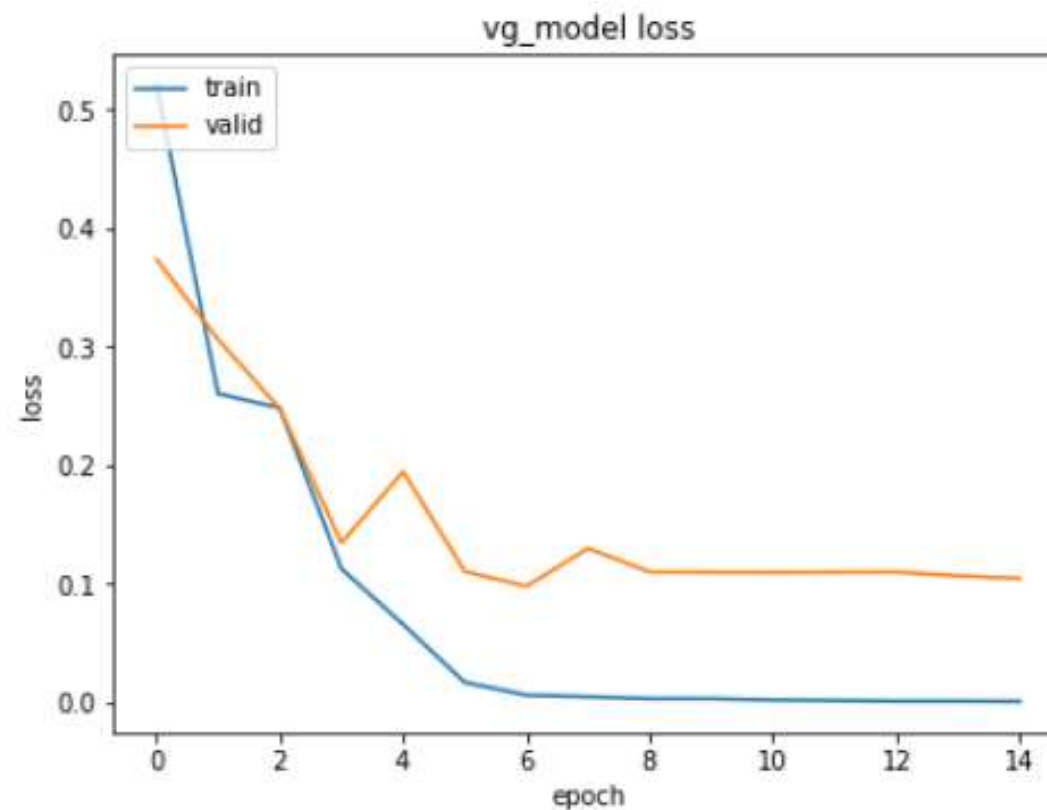
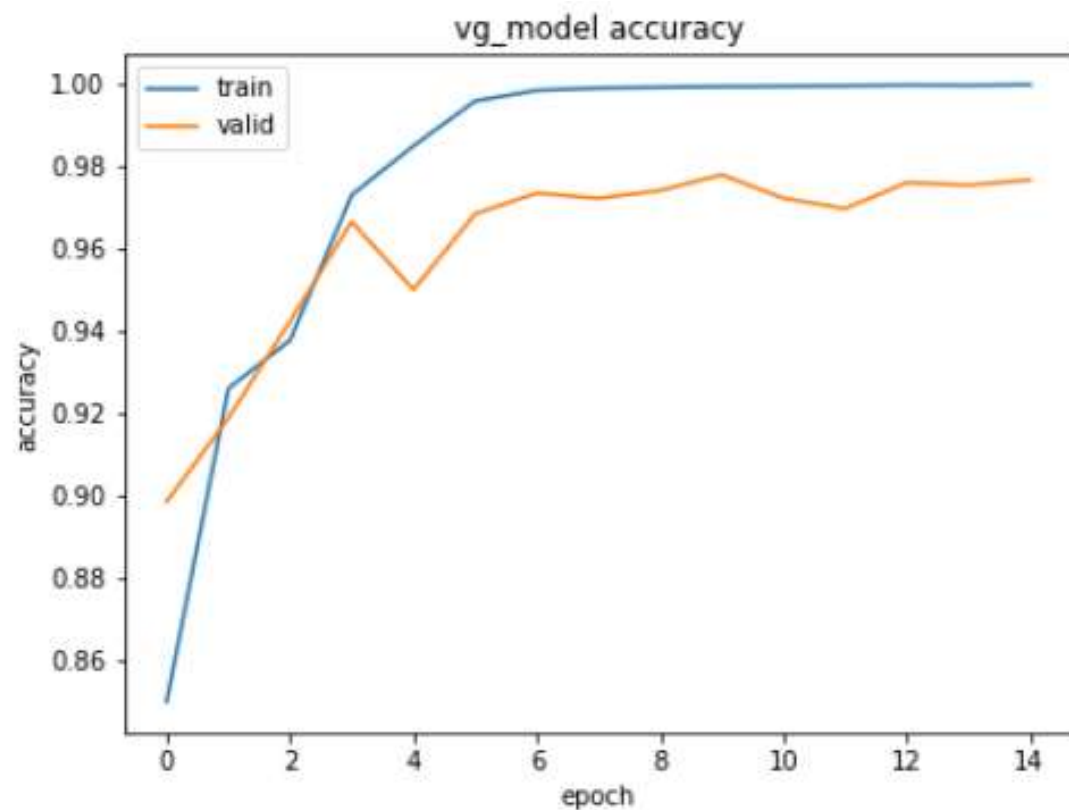
VGG16 Model

- A key distinction with VGG16 is rather than have large number of hyper-parameters they instead focused on having many convolution layers of 3x3 filters and always used same padding with a maxpool layer of 2x2.
- Has approximately 138 million parameters.
- Able to get 94% accuracy score after 23 epochs



Tuning VGG16

- Freezing lower layers
- 97.5% accuracy on unseen data



Predictions

VGG16
Prediction vs Actual Bird Species

Predicted: KILLDEAR
Truth: KILLDEAR



Predicted: KILLDEAR
Truth: KILLDEAR



Predicted: LILAC ROLLER
Truth: LILAC ROLLER



Predicted: JAVA SPARROW
Truth: JAVA SPARROW



Predicted: JAVA SPARROW
Truth: JAVA SPARROW



Predicted: IWI
Truth: IWI



Predicted: LONG-EARED OWL
Truth: LONG-EARED OWL



Predicted: KILLDEAR
Truth: KILLDEAR



Predicted: LONG-EARED OWL
Truth: LONG-EARED OWL



Takeaways

- Achieved 97.5% accuracy
- Can distinguish even almost identical looking birds but are different species
- Can be easily trained on new data
- CNN is a challenging topic when diving into the math
- Future work, object and facial recognition