

# HERBARIUM 2021

## HALF-EARTH CHALLENGE – FGVC8

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*FGVC competition hosted as part of the FGVC8 workshop at CVPR 2021*

*Presented by:* Ricardo B. Sousa ([up201503004](#))

FEUP, PDEEC, Computer Vision, 2020/2021

# OUTLINE

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- Introduction
- Related Work
- Dataset
- ResNet
- Data Augmentation
- Experimental Results
- Conclusions & Future Work

# INTRODUCTION: CONTEXT

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- Approximately 3,000 herbaria in the world
- Herbaria represent massive repositories of plant diversity data

# INTRODUCTION: MOTIVATION

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- Approximately 3,000 herbaria in the world
- Herbaria represent massive repositories of plant diversity data



- The Herbarium 2021: Half-Earth Challenge as a image classification competition
- Dataset with approximately 65,000
- DCNN have become the state-of-the-art for image classification

# INTRODUCTION: GOALS

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- Image classification of plant species of the Herbarium 2021 dataset
- Influence of data augmentation on the test results

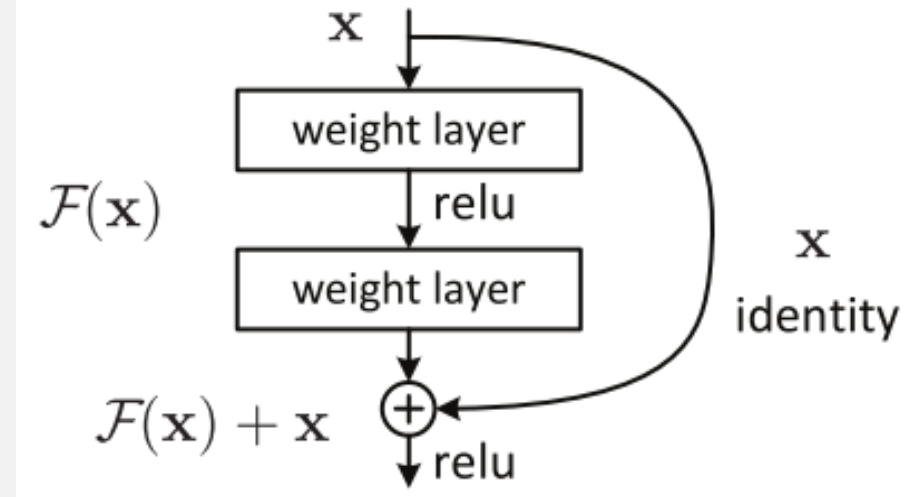
# DATASET: HERBARIUM 2021

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- Data provided by several herbaria
- COCO format
- Includes region and supercategory information
- 2,500,779 images
  - ~80%/20% split for training/test
  - 64,500 species
  - Min. 3 images/species
  - Min. 1 image in training and test
  - Test set: max. 10 images/species

# RESNET

- Identity shortcut connections
- Deeper networks while avoiding degradation problem
- Available in PyTorch:
  - ResNet-18, ResNet-34, ResNet-50, ResNet-101, ResNet-152



# DATA AUGMENTATION

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- Dataset provided by several herbaria and different people
- Different positions or orientations for the plant species
- Plant species can be related with color



# DATA AUGMENTATION

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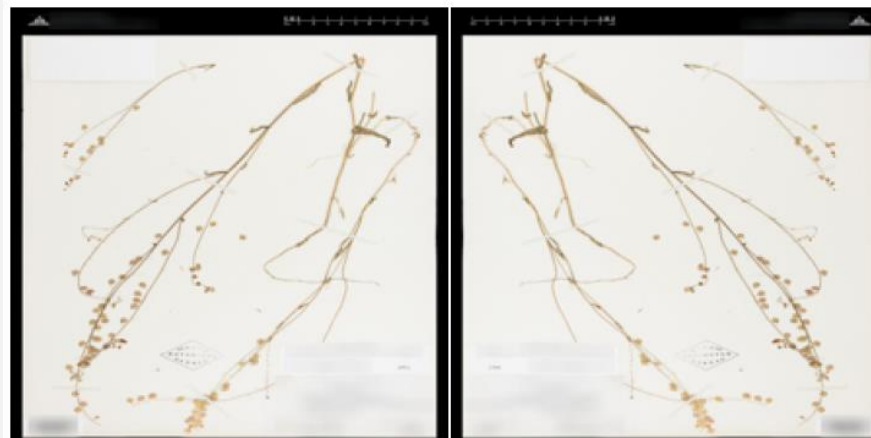
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## **Data augmentation with geometric transformations**

1. Horizontal flip ( $p=0.25$ )
2. Vertical flip ( $p=0.25$ )
3. Rotation up to  $10^\circ$  ( $p=0.05$ )

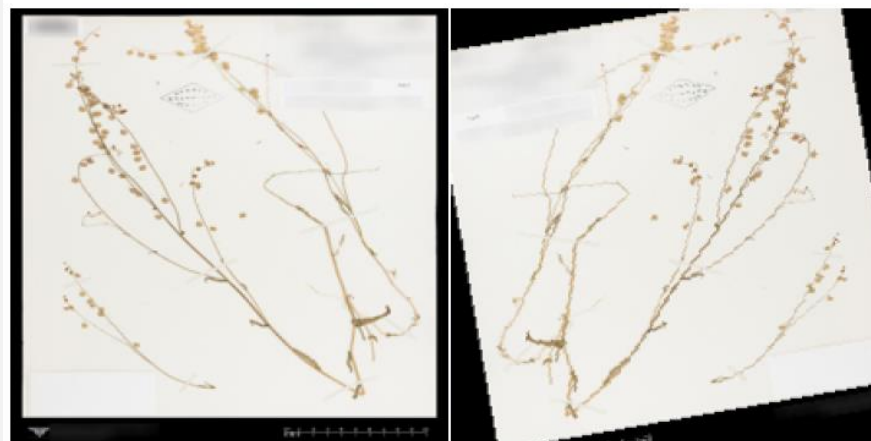
# DATA AUGMENTATION

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(a)

(b)



(c)

(d)

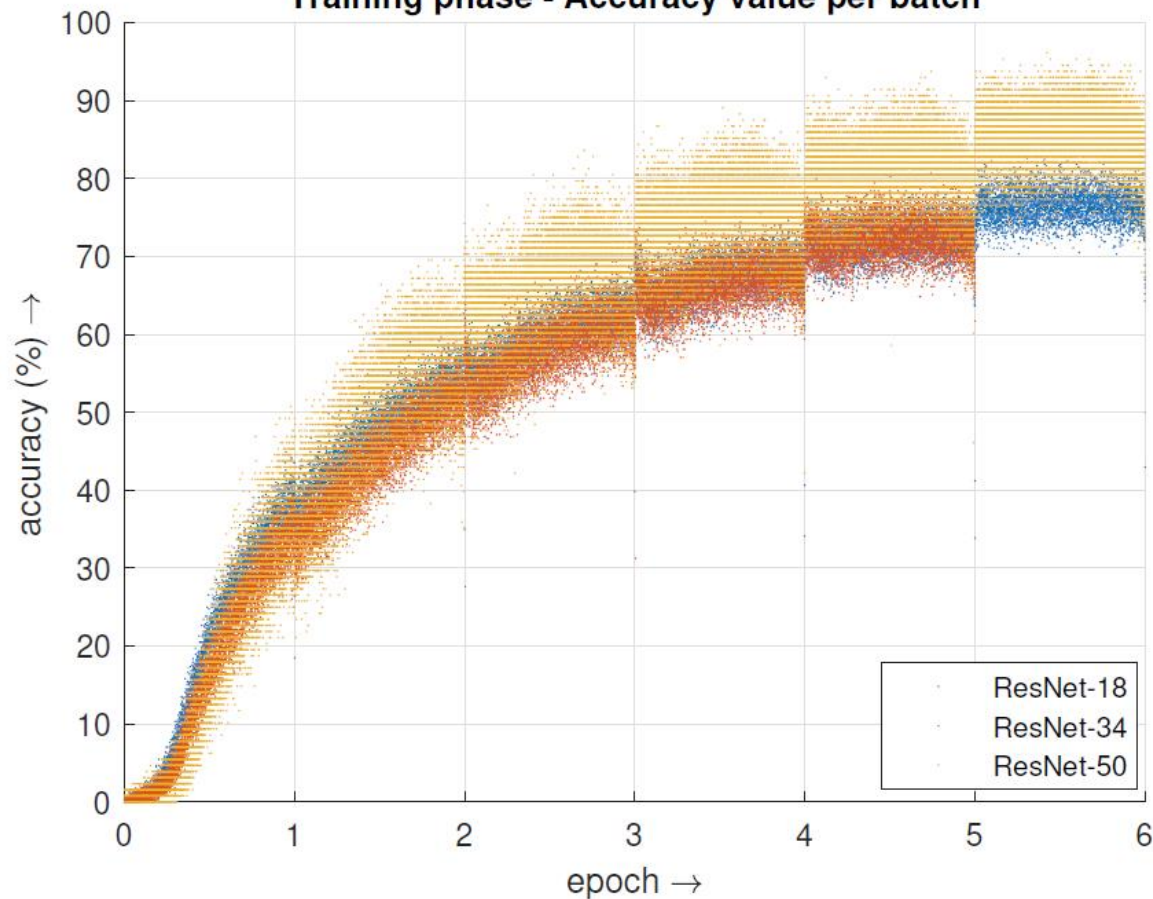
# EXPERIMENTAL RESULTS: TRAINING PHASE

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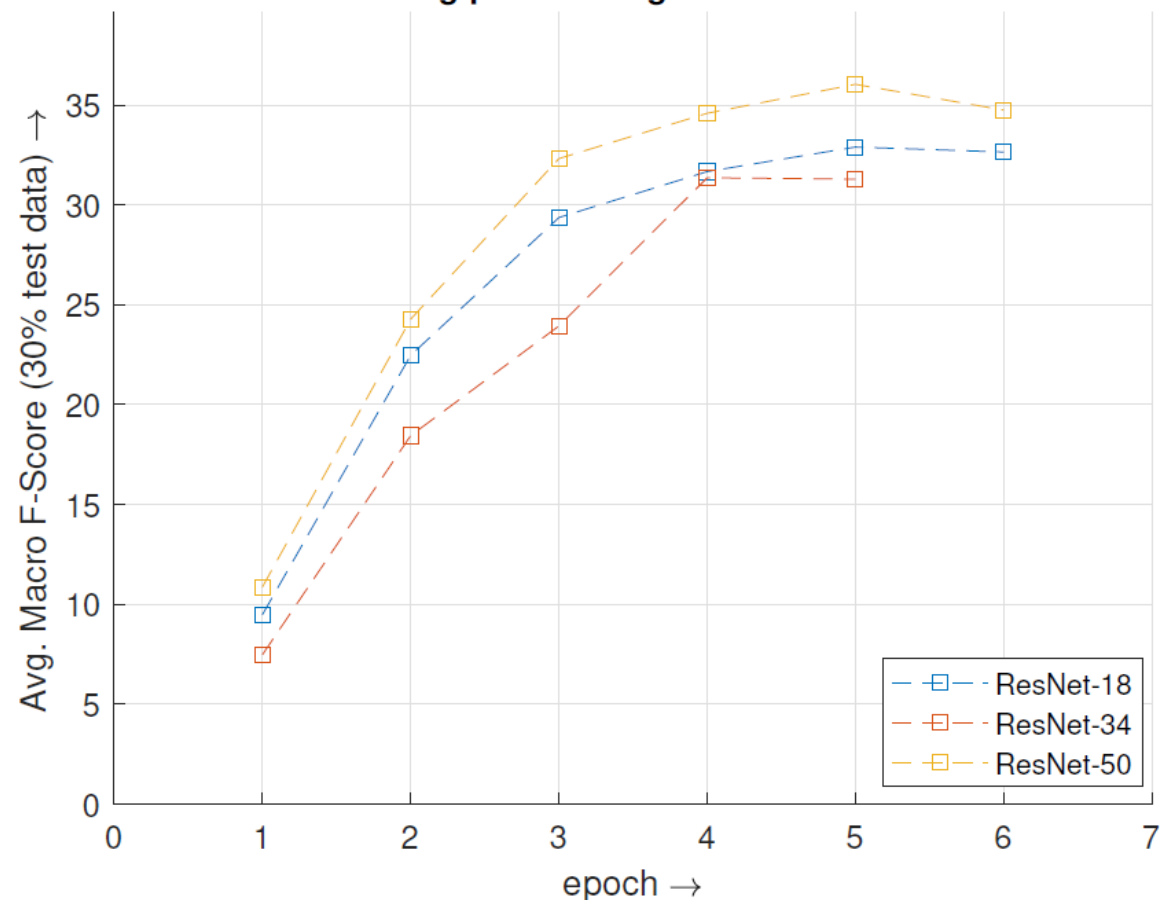
- Kaggle notebooks
- Virtual Machine with:
  - Intel Xeon CPU @ 2.00GHz
  - Nvidia Tesla P100 PCIE 16GB
- Adam optimizer w/ learning rate  $4 \times 10^{-4}$
- Batch size:
  - ResNet-18: 512 images
  - ResNet-34: 384 images
  - ResNet-50: 128 images

# EXPERIMENTAL RESULTS: COMPARISON RESNET MODELS

Comparison of ResNet models on the Herbarium 2021 dataset  
Training phase - Accuracy value per batch

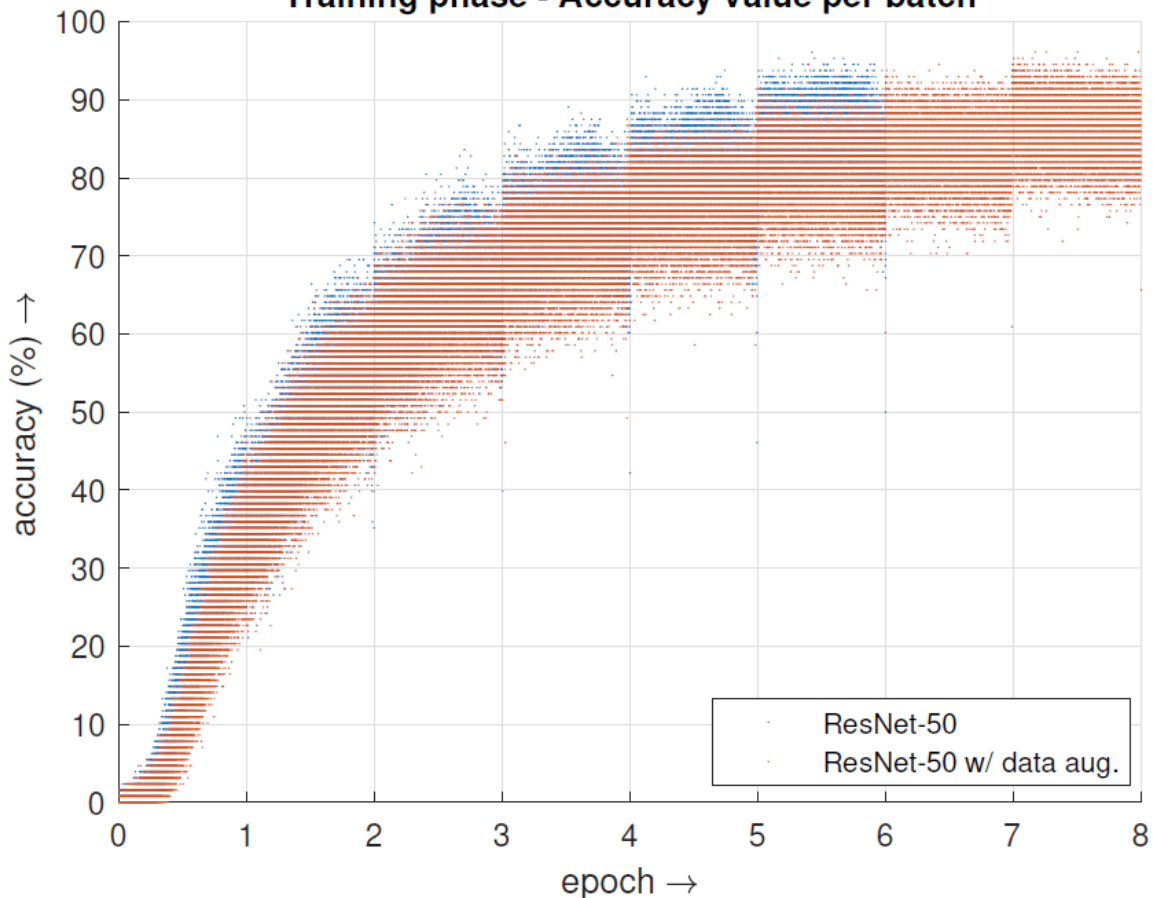


Comparison of ResNet models on the Herbarium 2021 dataset  
Testing phase - Avg. Macro F-Score

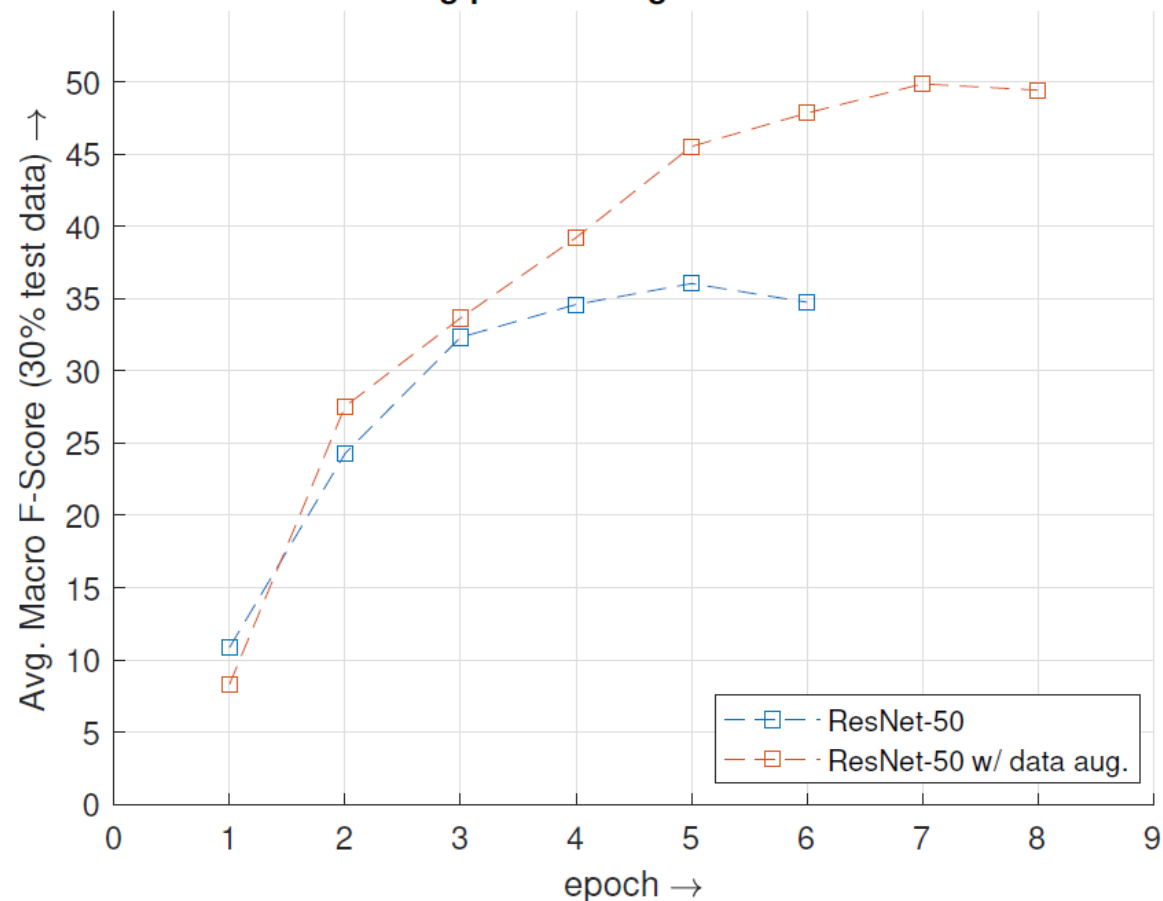


# EXPERIMENTAL RESULTS: IMPACT OF DATA AUGMENTATION

Impact of using data augmentation on the Herbarium 2021 dataset  
Training phase - Accuracy value per batch



Impact of using data augmentation on the Herbarium 2021 dataset  
Testing phase - Avg. Macro F-Score



# CONCLUSIONS & FUTURE WORK

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- Deeper networks seemed to increase the classification results
- Data augmentation crucial to improve the test Macro F-Score (49.85% vs 36.04%)
- 13<sup>th</sup> place on the Kaggle competition:
  - 49.851% w/ 30% test data
  - 44.841% w/ 70% test data
- Higher number of ResNet layers or EfficientNet-based network
- Supercategory information to implement a hierarchical model
- Optimize parameters used in the data augmentation techniques and optimization algorithm
- Evaluate other scores in the training phase:
  - Average Macro F-Score, precision, recall

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