Plant Seedlings Classification

Using Instagram and ImageNet pretrained deep convolutional networks for seedling species image classification

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Introduction

- Image Classification field is dominated by deep convolutional networks
- Problem: Long time to train
- One Solution: Pretrained models using Imagenet and Instagram
- Application of pretrained model for Plant Seedling Kaggle competition

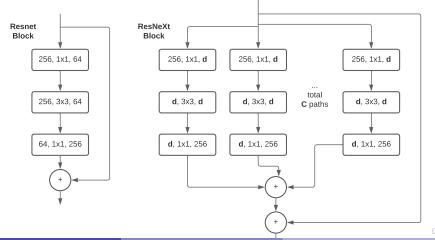
Data preprocessing

- 12 weed and crop species
- The train data contains 4750 annotated species (25% as validation data)
- Test data: 794 unannotated images



Tested methods

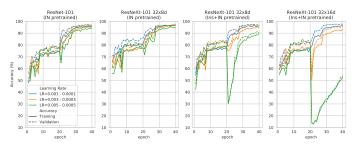
- ResNet101 with ImageNet pretrained
- ResNeXt-101-32x8d ImageNet pretrained
- ResNeXt-101-32x8d Instagram + ImageNet pretrained
- ResNeXt-101-32x16d Instagram + ImageNet pretrained

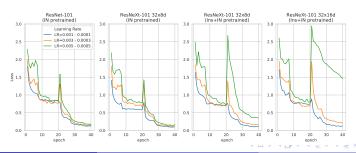


Training

- Data augmentation:
 - Random Crop
 - Random horizontal flip
 - Random resize
- Training in two stages
 - 20 epochs training the last linear layer
 - 20 epochs training the complete neural network
- Learning rate decrease every 7 epochs

Learning Rate tuning

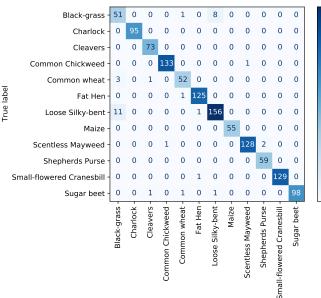


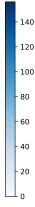


Validation data performance

| Class | ResNet- | ResNeXt- | ResNeXt- | ResNeXt- |
|---------------------------|-------------|-----------|-------------|-------------|
| | 101 (IN | 101 32×8d | 101 32×8d | 101 32×16d |
| | Pretrained) | (IN Pre- | (Ins+IN | (Ins+IN |
| | | trained) | Pretrained) | Pretrained) |
| Black-grass | 76.67% | 81.67% | 76.67% | 85.00% |
| Charlock | 100.00% | 100.00% | 100.00% | 100.00% |
| Cleavers | 95.89% | 97.26% | 98.63% | 100.00% |
| Common Chickweed | 100.00% | 98.51% | 100.00% | 99.25% |
| Common wheat | 96.43% | 98.21% | 96.43% | 92.86% |
| Fat Hen | 100.00% | 99.21% | 99.21% | 99.21% |
| Loose Silky-bent | 95.83% | 97.62% | 92.26% | 92.86% |
| Maize | 98.18% | 100.00% | 100.00% | 100.00% |
| Scentless Mayweed | 97.71% | 97.71% | 97.71% | 97.71% |
| Shepherds Purse | 89.83% | 96.61% | 94.92% | 100.00% |
| Small-flowered Cranesbill | 100.00% | 100.00% | 98.46% | 99.23% |
| Sugar beet | 98.02% | 96.04% | 99.01% | 97.03% |
| Overall accuracy | 96.80% | 97.47% | 96.63% | 97.14% |

Validation data performance





Test data: Kaggle submission

| Model | Mean F1 Score | Simulated Leader- | |
|--|--------------------|-------------------|--|
| | (Overall accuracy) | board position | |
| Resnet-101 (IN Pretrained) | 0.97103 | 262/833 (31.45%) | |
| ResneXt-101 32x8d (IN Pretrained) | 0.97858 | 149/833 (17.89%) | |
| ResneXt-101 32x8d (Ins+IN Pretrained) | 0.97732 | 173/833 (20.77%) | |
| ResneXt-101 32×16d (Ins+IN Pretrained) | 0.97229 | 248/833 (29.77%) | |

| submission_kaggle_Resnext_101_32×8d_IN_WSL_Ir001_final.csv 6 days ago by Julian Cabezas Resnext_101_32×8d_IN_WSL_Ir001_final | 0.97732 | 0.97732 | |
|--|---------|---------|--|
| submission_kaggle_Resnext_101_32×16d_IN_WSL_fr001_final.csv 6 days ago by Julian Cabezas Resnext_101_32×16d_IN_WSL_fr001_final | 0.97229 | 0.97229 | |
| submission_kaggle_Resnext_101_32×8d_IN_Ir001_final.csv 7 days ago by Julian Cabezas Resnext 101 32×8d IN | 0.97858 | 0.97858 | |
| submission_kaggle_Resnet_101_fr001_final.csv 7 days ago by Jutian Cabezas Resnet 101 final | 0.97103 | 0.97103 | |

Kaggle user: JulianCabezas

Conclusion

- The pretraining using the Instagram data does not produce better results than the ImageNet pretraining in this case
- ResNeXt architecture slightly outperformed equivalent ResNet Neural networks
- Pretrained models can produce competitive, accurate and time efficient predictions for plant seedling classification