

### Introduction

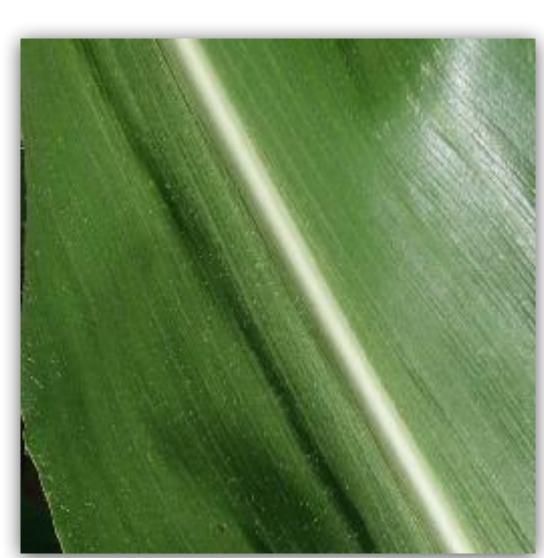
- Machine Learning -> Agriculture
- Computer vision models applied to disease detection
- Northern Leaf Blight causes ~\$2 billion in damage per year
- Lack of data readily available
- Transfer learning can help!



# Data Sets



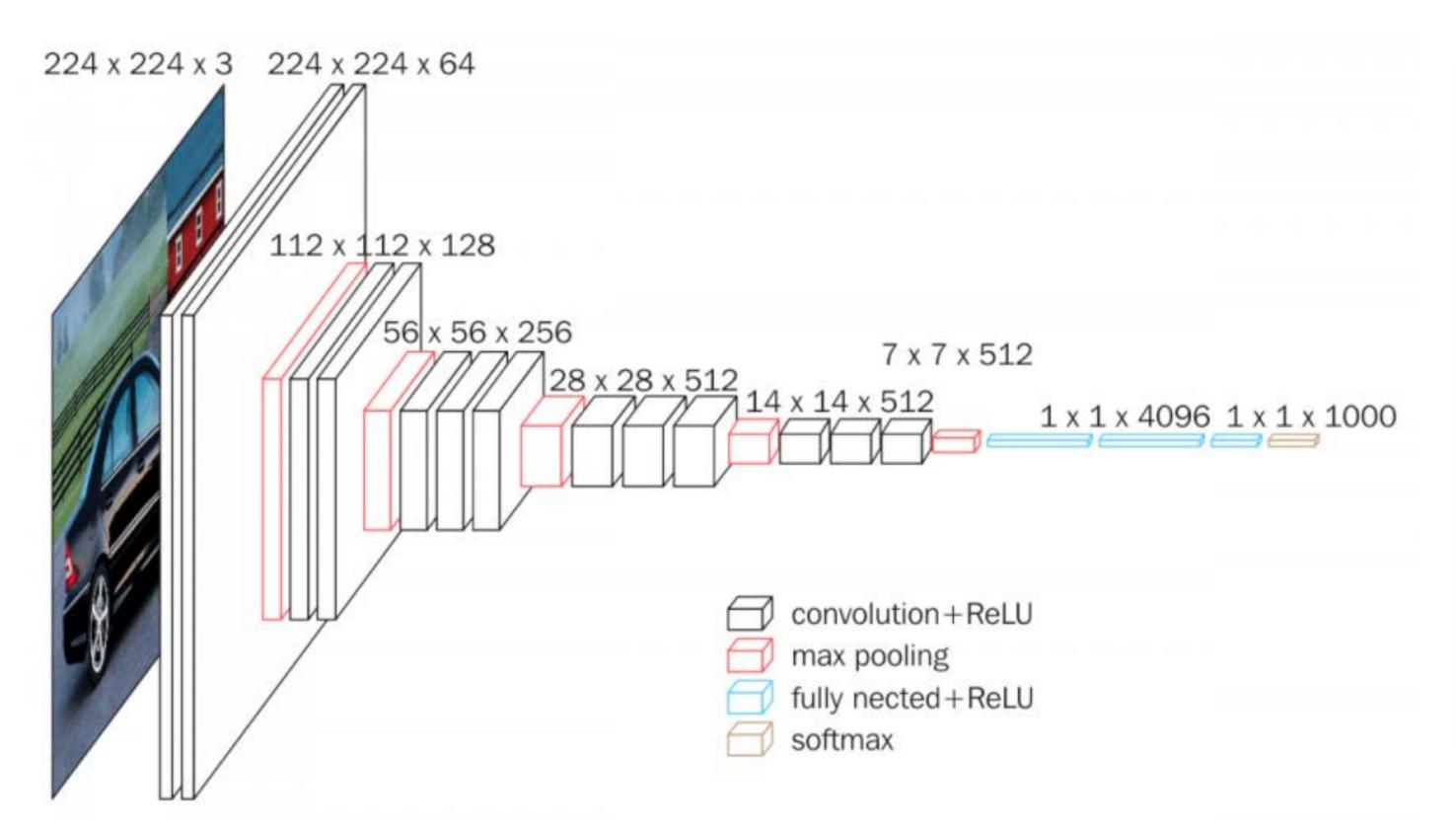


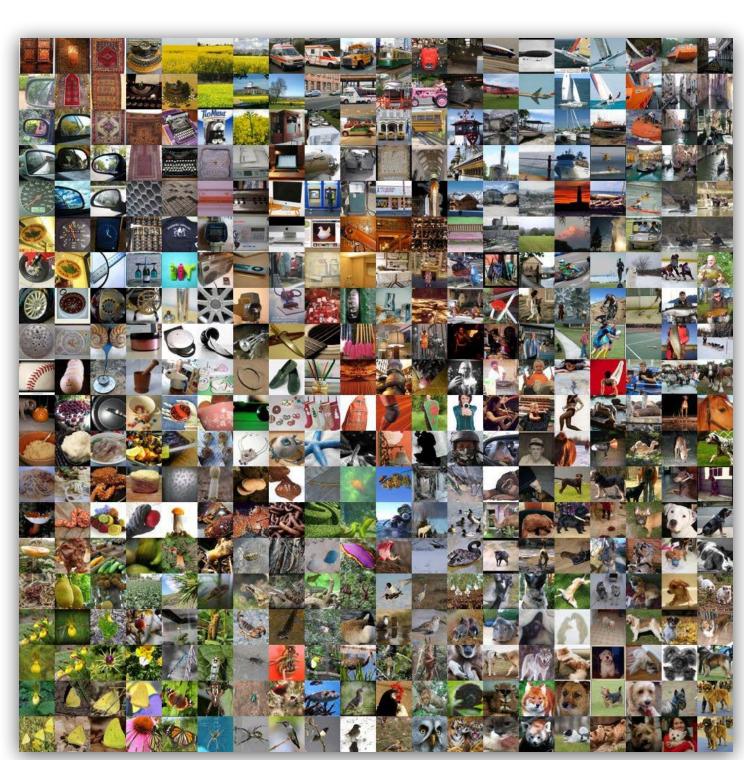


PlantVillage

OSF

# Hello, VGG-16





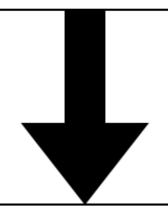
ImageNet

# Experimental Models

#### "Normal"

#### **VGG-16:**

Weights: Random Training: PlantVillage Classes: 36



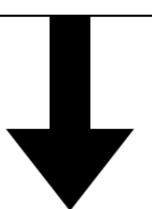
#### **VGG-16:**

Weights: Random+PV
Training: OSF
Classes: 2

#### "ImageNet"

#### **VGG-16:**

Weights: ImageNet
Training: PlantVillage
Classes: 36



#### VGG-16:

Weights: IN+PV
Training: OSF
Classes: 2

#### "S2-Scratch"

#### VGG-16:

Weights: Random Training: OSF Classes: 2

### "S2-ImageNet"



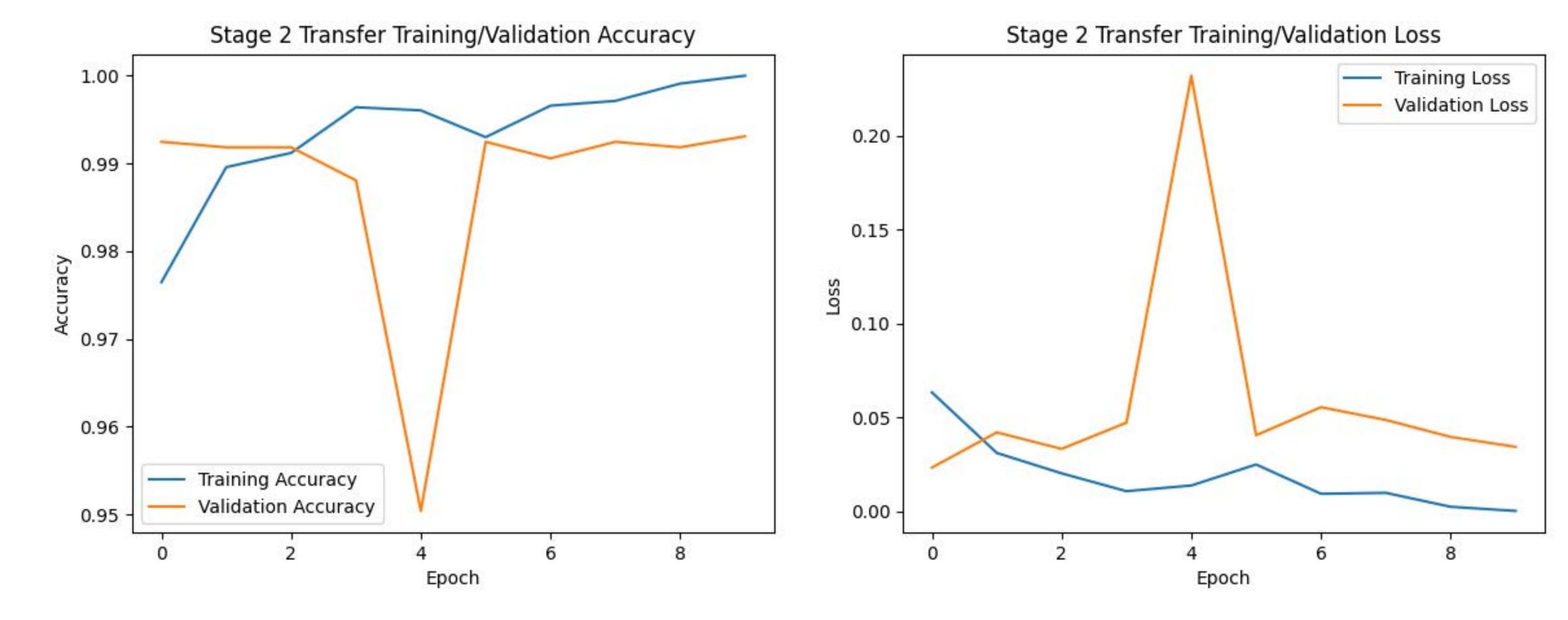
#### **VGG-16:**

Weights: ImageNet
Training: OSF
Classes: 2

# Results

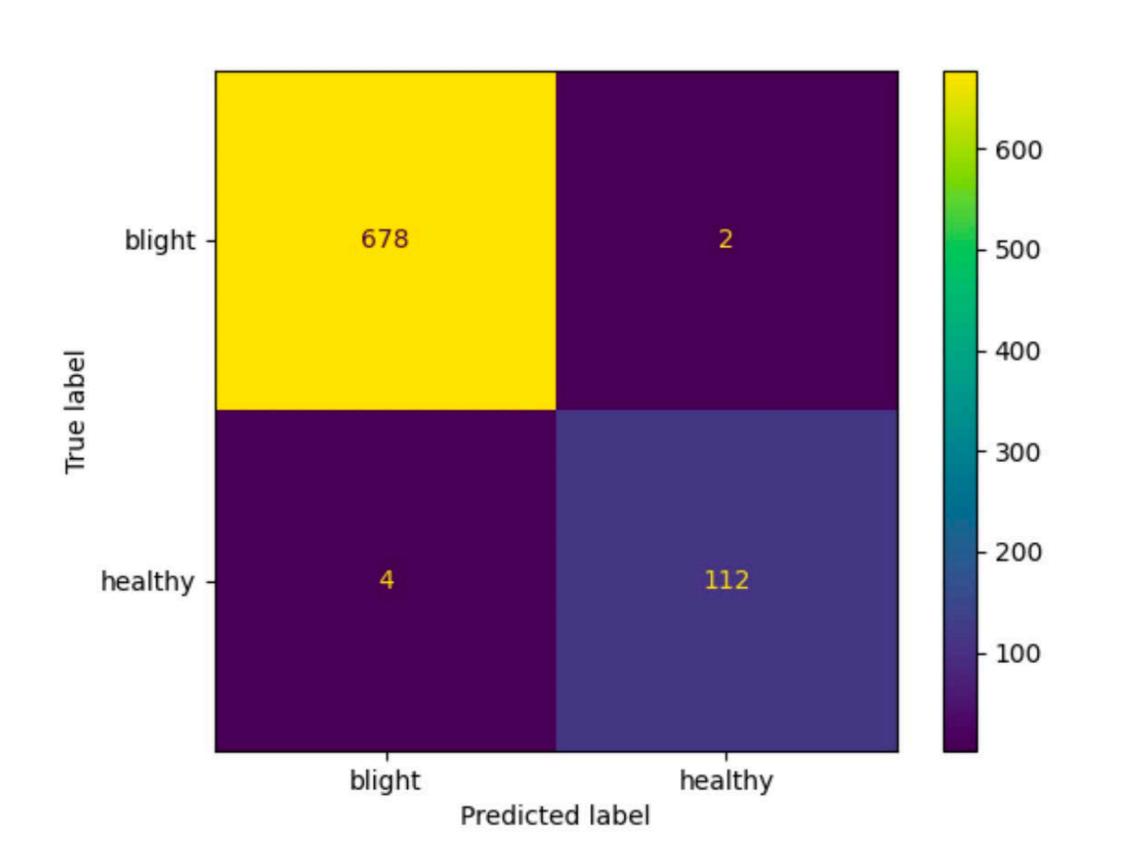
| Transfer Model | Evaluation Criteria |               | Test Results |              |              |              |
|----------------|---------------------|---------------|--------------|--------------|--------------|--------------|
|                | Epochs              | Learning Rate | Stage 1 Acc. | Stage 1 Loss | Stage 2 Acc. | Stage 2 Loss |
| Normal         | 5                   | 0.0001        | 0.9247       | 0.2953       | 0.95226      | 0.1142       |
|                | 10                  | 0.01          | 0.1058       | 3.284        | 0.8543       | 0.4155       |
|                | 10                  | 0.001         | 0.1054       | 3.284        | 0.8328       | 3.165        |
|                | 10                  | 0.0001        | 0.9234       | 0.3153       | 0.9422       | 0.1429       |
| ImageNet       | 5                   | 0.0001        | 0.9459       | 0.1663       | 0.9899       | 0.03172      |
|                | 10                  | 0.01          | 0.9376       | 4.667        | 0.9899       | 0.3899       |
|                | 10                  | 0.001         | 0.9340       | 0.5017       | 0.9925       | 0.02814      |
|                | 10                  | 0.0001        | 0.9553       | 0.1341       | 0.9874       | 0.03538      |
| S2-Scratch     | 5                   | 0.0001        | <u> </u>     | <u>u</u>     | 0.9673       | 0.1952       |
|                | 10                  | 0.01          | <u> </u>     | <u> </u>     | 0.8543       | 3.882        |
|                | 10                  | 0.001         | 2 <u>7</u>   | <u></u> -    | 0.8543       | 0.4153       |
|                | 10                  | 0.0001        | <u> </u>     | <del></del>  | 0.9849       | 0.07688      |
| S2-ImageNet    | 5                   | 0.0001        | ===          |              | 0.9887       | 0.03575      |
|                | 10                  | 0.01          |              | <del></del>  | 0.9874       | 0.7633       |
|                | 10                  | 0.001         | -            | -            | 0.9899       | 0.06181      |
|                | 10                  | 0.0001        |              | =====        | 0.9899       | 0.2811       |

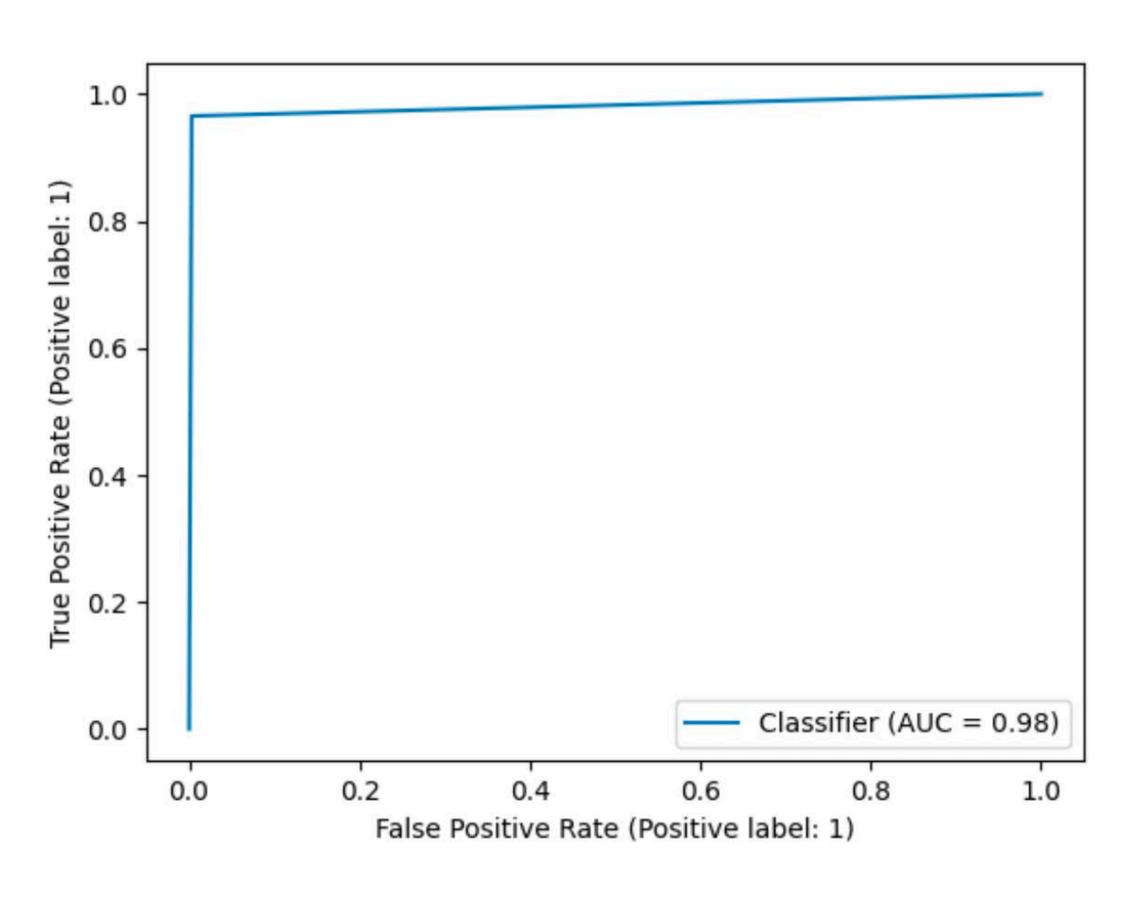
### Results



ImageNet Transfer Model: 0.9925 test accuracy

# Results





## Observations

- More data=better results!
- ImageNet weights were very helpful
- Imbalanced class distribution
- Would like to repeat with larger data set
- Overall nearly all models ended up being effective



## References

- 1. T. Wiesner-Hanks and M. Brahimi, "Image set for Deep Learning: Field images of maize annotated with disease symptoms," OSF, 28-Mar-2018. [Online]. Available: https://osf.io/p67rz/wiki/home/. [Accessed: 15-Dec-2021].
- 2. M. Salathe, "An open access repository of images on plant health to enable the development of Mobile Disease Diagnostics," arXiv.org, 12-Apr-2016. [Online]. Available: https://arxiv.org/abs/1511.08060. [Accessed: 15-Dec-2021].
- 3. K. Simonyan and A. Zisserman, "Very deep convolutional networks for large-scale image recognition," arXiv.org, 10-Apr-2015. [Online]. Available: https://arxiv.org/abs/1409.1556. [Accessed: 15-Dec-2021].

