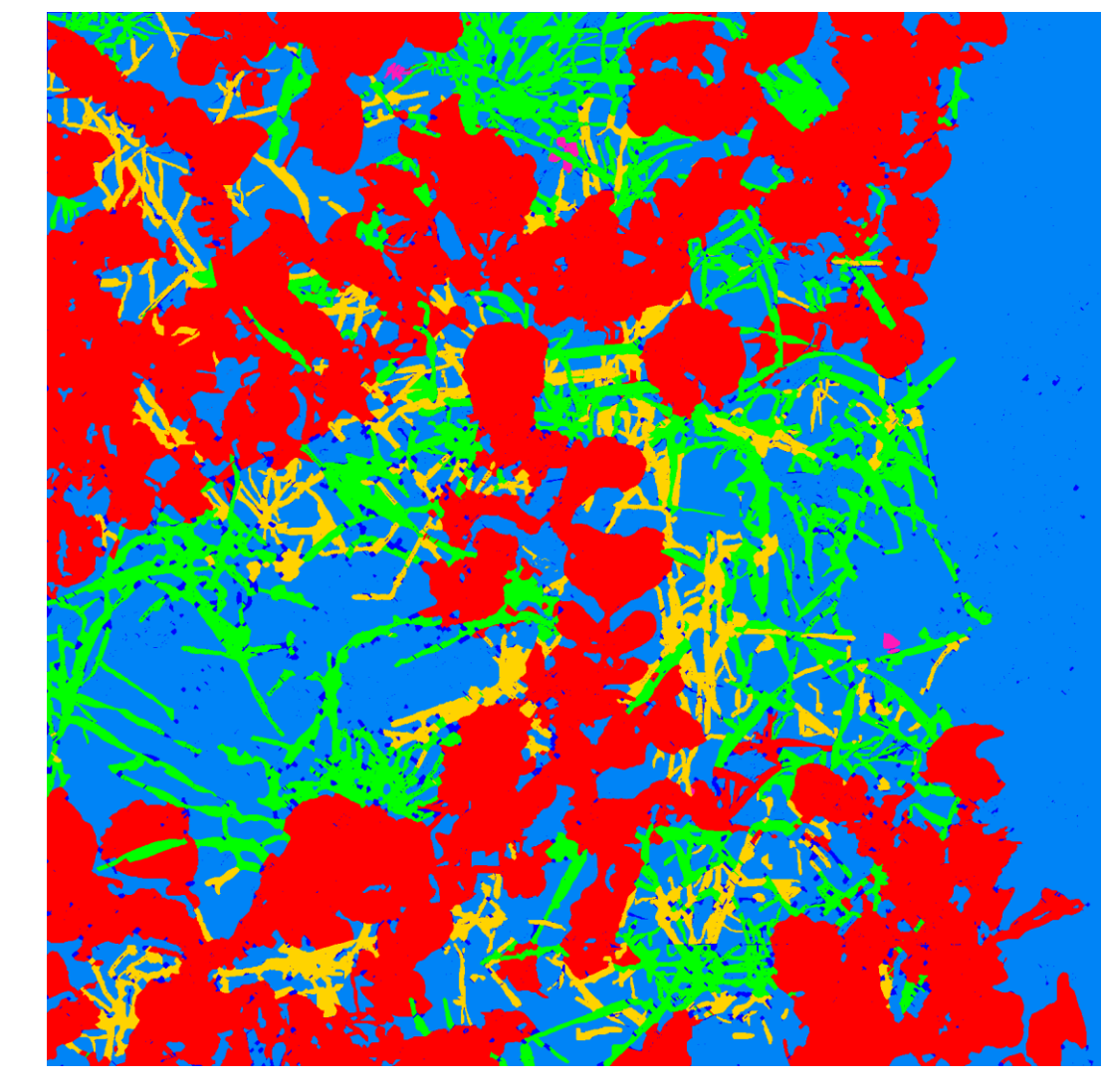


1. Problem:

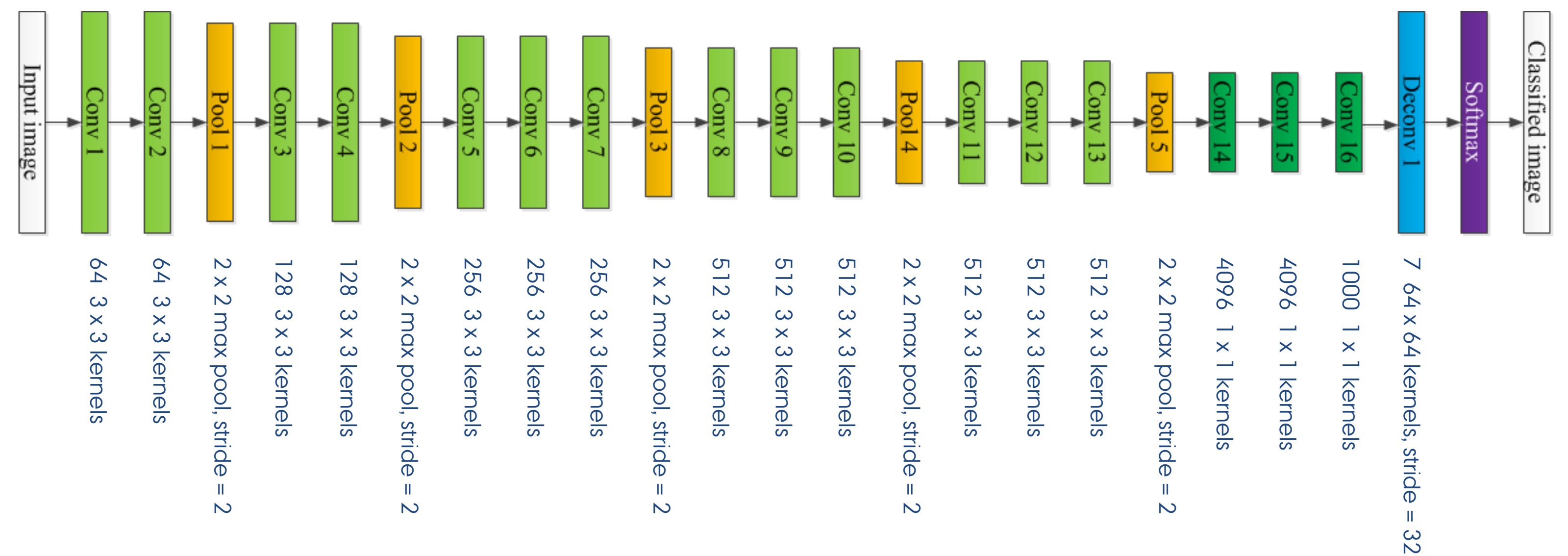
- What?
 - Pixel-wise classification of top view images of mixed crops
- Why?
 - Yield estimation
 - Nitrogen-uptake estimation
 - Variable Nitrogen application to fields
 - Optimal harvest time



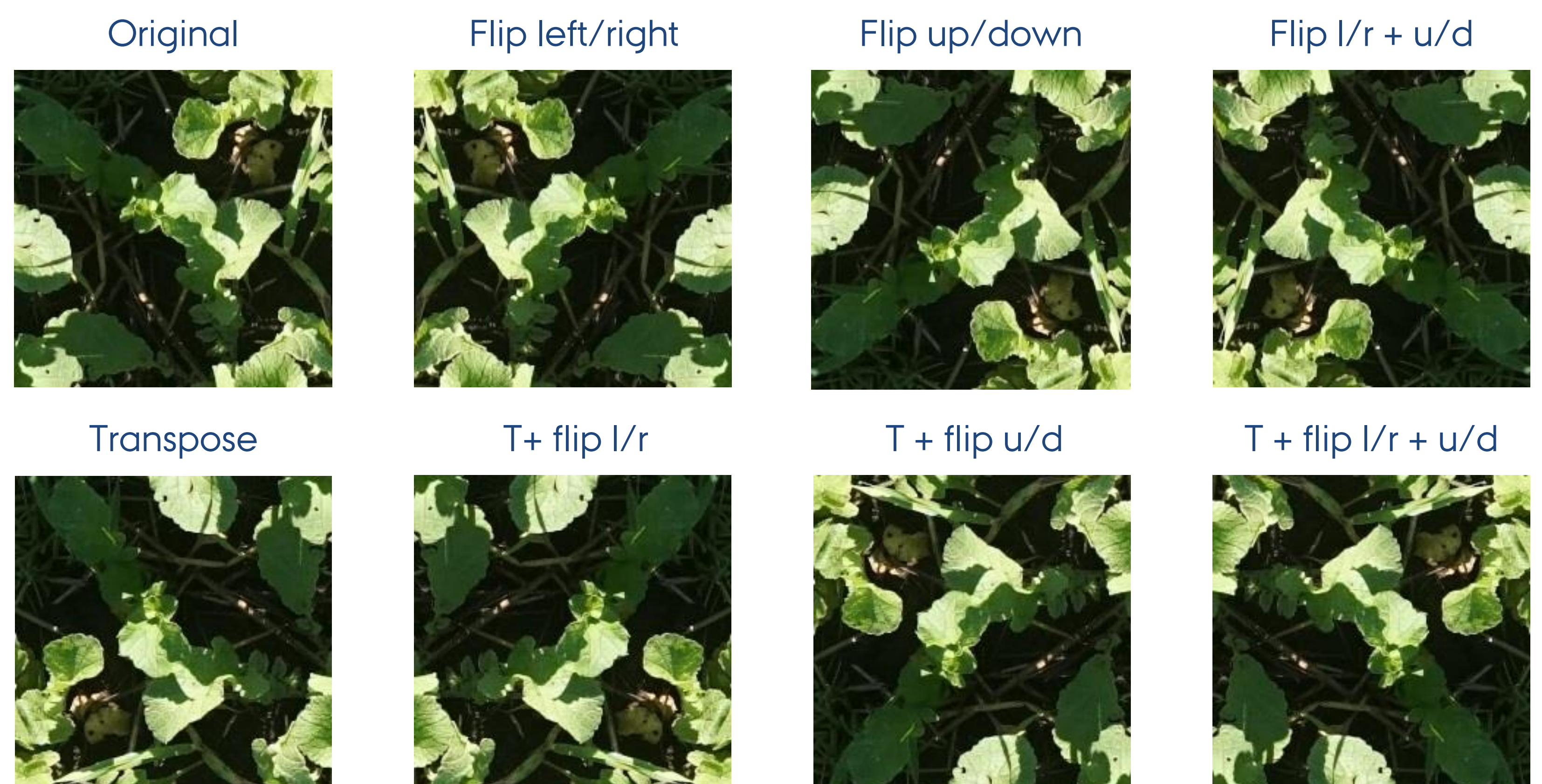
- Equipment
- Soil
- Stump
- Weed
- Barley/Grass
- Radish
- Unknown

2. Method:

- Fine-tuning on a pre-trained Deep Convolutional Neural Network
 - Based on VGG-16D for image classification [1]
 - Adapted to pixel-wise classification [2]:
 - Convert fully connected layers to convolutional layers
 - Insert deconvolutional layer
 - First, fine-tuned on PASCAL-Context [2]
 - Then, fine-tuned on own data

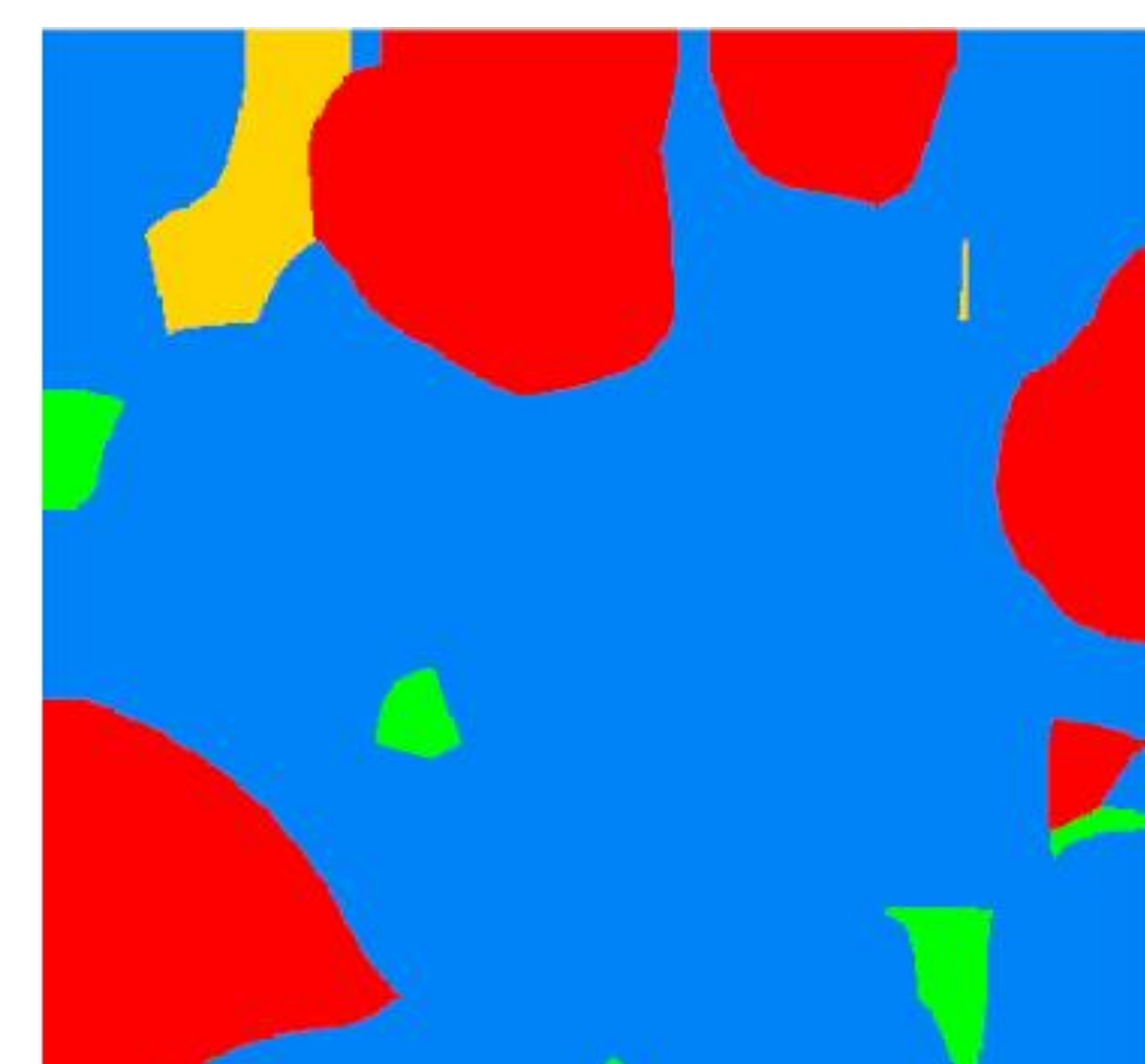
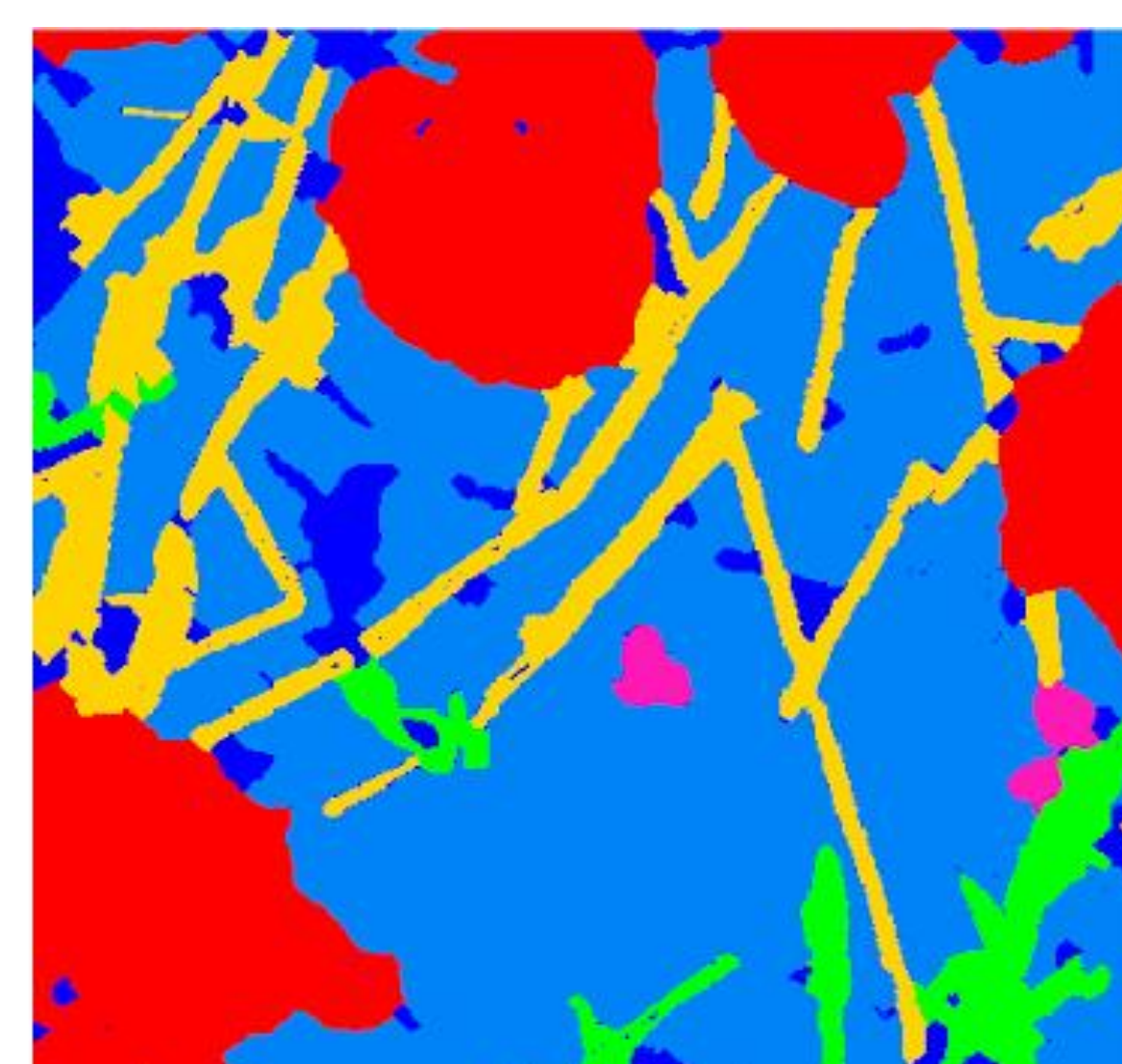


- Data set
 - 48 images
 - 400 x 400 pixels
 - 75% used for training
 - 7 classes
 - Unknown, Radish, Barley/Grass, Weed, Stump, Soil, Equipment
- Data argumentation to increase data set
 - Flip left/right, flip up/down and transpose
- Learning parameters
 - Learning rate: 10^{-9}
 - Per pixel learning rate: $\sim 1.6 \cdot 10^{-4}$



3. Results:

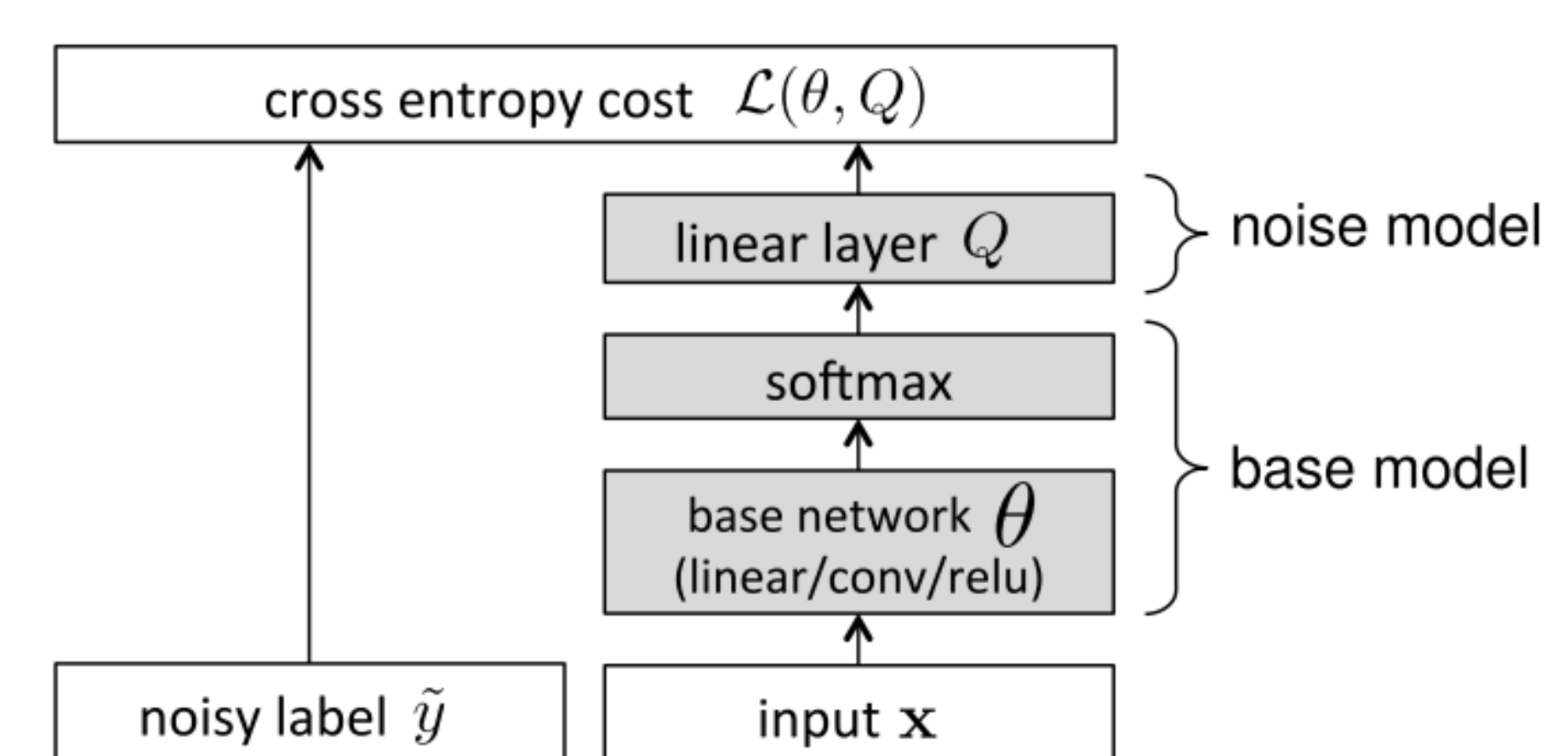
- Pixel-wise classification:
 - Pixel accuracy: 79 %
 - Frequency weighted IoU: 66%
- Ensemble classification
 - Pixel accuracy: 80 %
 - Frequency weighted IoU: 67%



- Equipment
- Soil
- Stump
- Weed
- Barley/Grass
- Radish
- Unknown

4. Discussion and conclusion:

- Works relatively well, but only tested on small labelled data set
- Large un-labelled dataset + small labelled dataset \rightarrow semi-supervised learning?
 - How?
 - Auto-encoders?
 - Learning Noise model? [3]



Source: Sukhbaatar et al. 2014 [3]

5. References:

- [1] Simonyan, K., & Zisserman, A. (2015). Very Deep Convolutional Networks for Large-Scale Image Recognition. Intl. Conf. on Learning Representations (ICLR), 1-14.
- [2] Long, J., Shelhamer, E., & Darrell, T. (2015). Fully Convolutional Networks for Semantic Segmentation. Proceedings of the IEEE Conference on Computer Vision and Pattern Recognition, 3431-3440.
- [3] Sukhbaatar, S., Bruna, J., Paluri, M., Bourdev, L., & Fergus, R. (2014). Training Convolutional Networks with Noisy Labels, 1-10. Retrieved from <http://arxiv.org/abs/1406.2080>