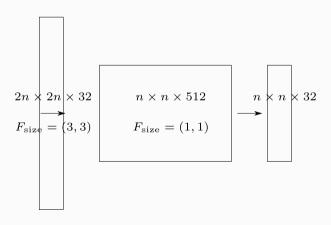
Ground Detection

April 10, 2019

Ecole des Mines Fontainebleau

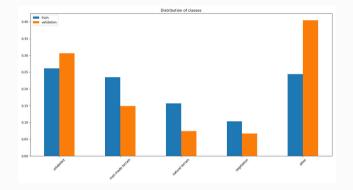
U-Net 6



1

Classes

- Unlabeled
- man-made terrain
- natural terrain
- vegetation
- other

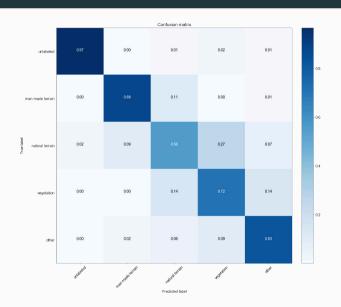


Features Tested

- 1. Normal
- 2. Normal + z
- 3. Normal +z + refl

Normals: Confusion matrix

- 1. 27% of "natural terrain" is classified as "vegetation"
- 2. 14% of "vegetation" is classified as "natural terrain"
- 14% of "vegetation" is classified as "other (buildings)"
- 4. 11% of "man-made terrain" is classified as "natural terrain"



Natural terrain classified as vegetation: Example 22

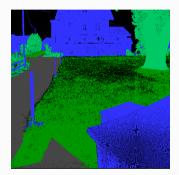


Figure 1: Ground Truth

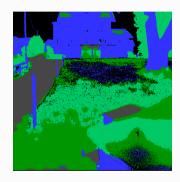


Figure 2: Prediction

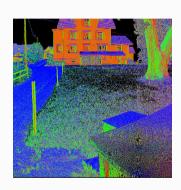


Figure 3: Normals

Vegetation classified as natural terrain: Example 12

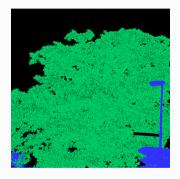


Figure 4: Ground Truth

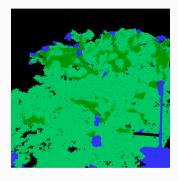


Figure 5: Prediction

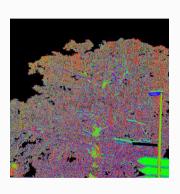


Figure 6: Normals

Vegetation classified as other: Example 21

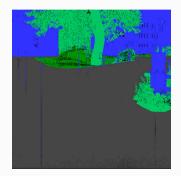


Figure 7: Ground Truth

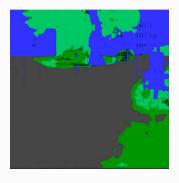


Figure 8: Prediction

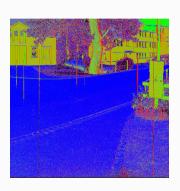


Figure 9: Normals

Man made terrain as natural terrain: Example 0

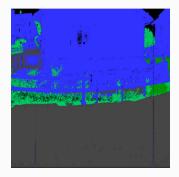


Figure 10: Ground Truth

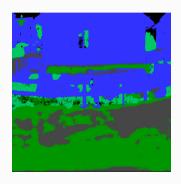


Figure 11: Prediction

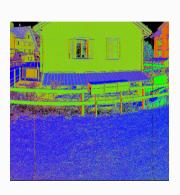
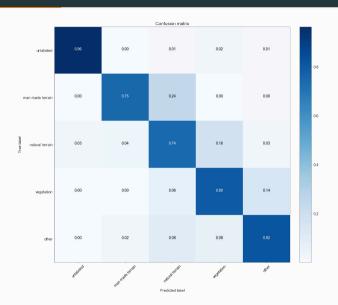


Figure 12: Normals

Normals + z: Confusion matrix

- 1. 24% of "man-made terrain" is classified as "natural terrain"
- 2. 16% of "natural terrain" is classified as "vegetation"
- 14% of "vegetation" is classified as "other (buildings)"



Normals + z: Example 12

Comparing Prediction

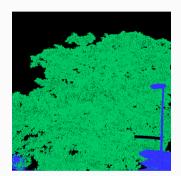


Figure 13: Ground Truth

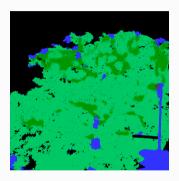


Figure 14: Prediction using Normals

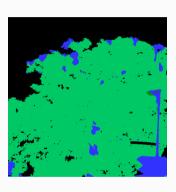


Figure 15: Prediction using Normals + z

Normals + z: Example 17

Comparing Prediction

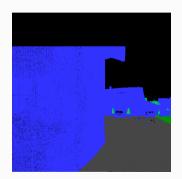


Figure 16: Ground Truth

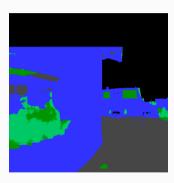


Figure 17: Prediction using Normals

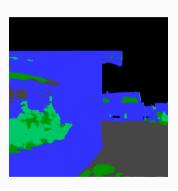


Figure 18: Prediction suing Normals + z

Man made terrain as natural terrain: Example 0

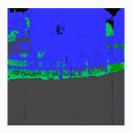


Figure 19: Ground Truth

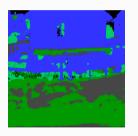


Figure 20: Prediction using normals

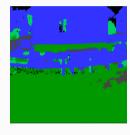


Figure 21: Prediction using normals + z

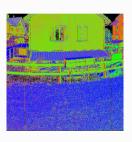


Figure 22: Normals

Natural terrain as vegetation: Example 22

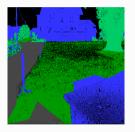


Figure 23: Ground Truth

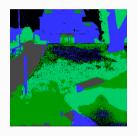


Figure 24: Prediction using normals

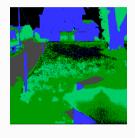


Figure 25: Prediction using normals + z

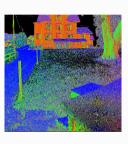


Figure 26: Normals

Vegetation as Other: Example 21

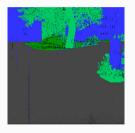


Figure 27: Ground Truth

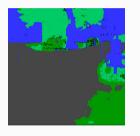


Figure 28: Prediction using normals

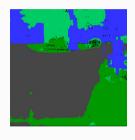


Figure 29: Prediction using normals + z

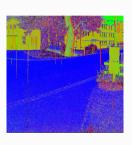
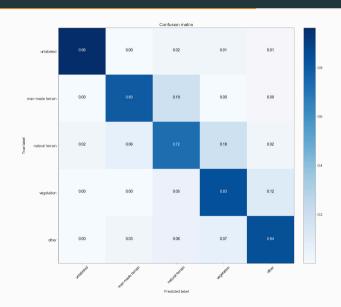


Figure 30: Normals

Normals + z + refl: Confusion matrix

- 1. 19% of "man-made terrain" is classified as "natural terrain"
- 2. 18% of "natural terrain" is classified as "vegetation"
- 12% of "vegetation" is classified as "other (buildings)"



Man made terrain as natural terrain: Example 0

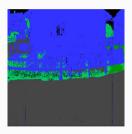


Figure 31: Ground Truth

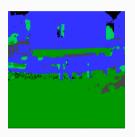


Figure 32: Prediction using normals + z

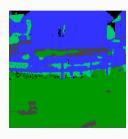


Figure 33: Prediction using normals + z + refl

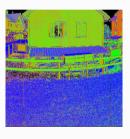


Figure 34: Normals

Natural terrain as vegetation: Example 22

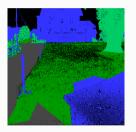


Figure 35: Ground Truth

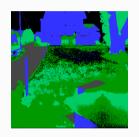


Figure 36: Prediction using normals + z

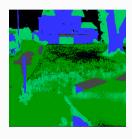


Figure 37: Prediction using normals + z + refl

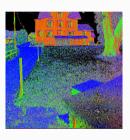


Figure 38: Normals

Normals + z + refl: Analysis of Errors

Vegetation as Other: Example 21

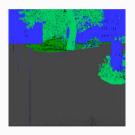


Figure 39: Ground Truth

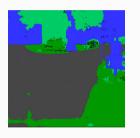


Figure 40: Prediction using normals + z

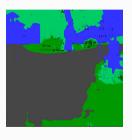


Figure 41: Prediction using normals + z + refl

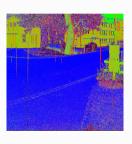


Figure 42: Normals

Unet F11: Normals + z + refl: Confusion matrix

- 1. 13% of "man-made terrain" is classified as "natural terrain"
- 9% of "natural terrain" is classified as "man-made terrain"
- 7% of "natural terrain" is classified as "vegetation"

