



# Autonomously Following Forest Paths with a Mobile Robot using Semantic Segmentation

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- Rover
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- Droneport Sint-Truiden
- Drone Surveying (agriculture, insurance, construction...)
- Rover kit, motoren, batterijen



# Model

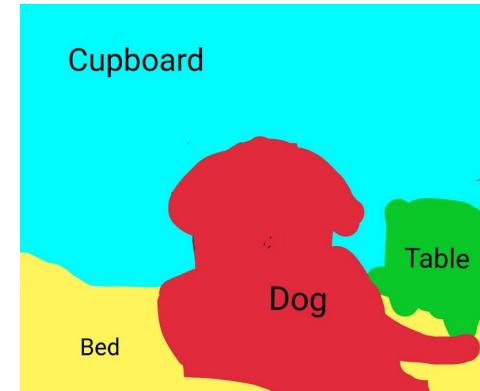
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# Prior art

- **Giusti et al.**  
A Machine Learning Approach to Visual Perception of Forest Trails for Mobile Robots
- **Smolyanskiy et al.**  
Toward Low-Flying Autonomous MAV Trail Navigation using Deep Neural Networks for Environmental Awareness

# Semantic segmentation

- Is a pixel road or not?
- Mask



*Garima Nishad*

# Datasets

- Freiburg (Deepscene)
- Giusti (Switzerland)
- Steentjes

# Freiburg (DeepScene)



*deepscene.cs.uni-freiburg.de*

# Giusti



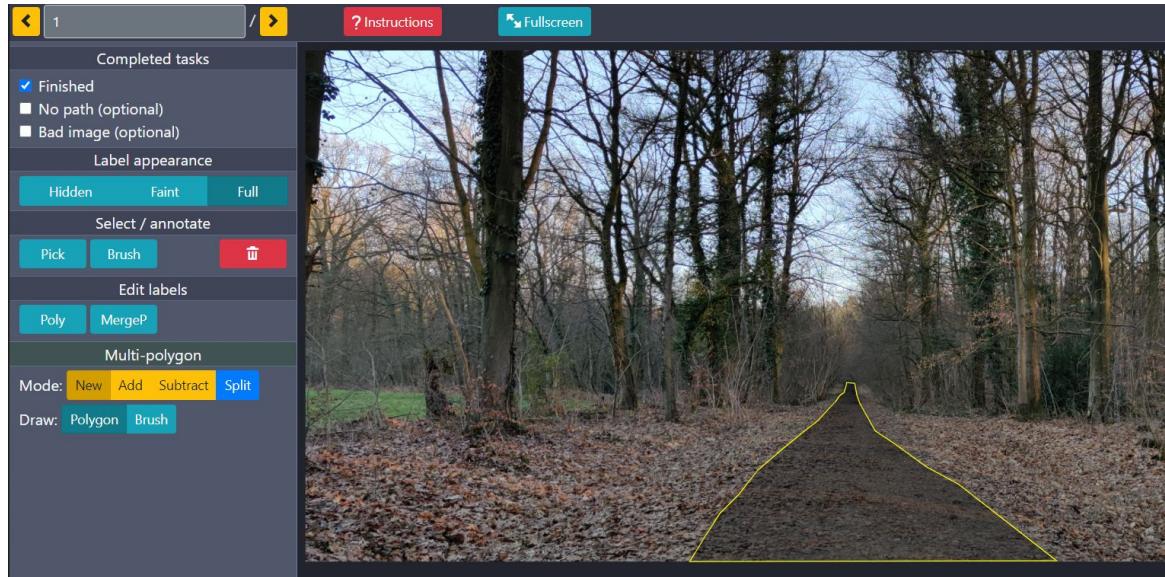
[people.idsia.ch/~giusti/forest/web/](http://people.idsia.ch/~giusti/forest/web/)

# Stentjes



Stentjesbos Kampenhout

# Labeling tool



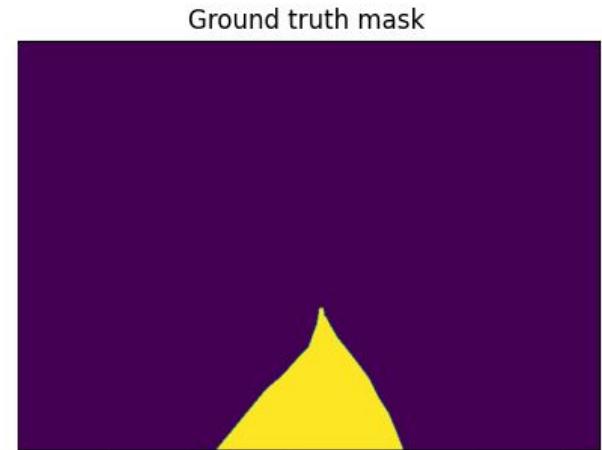
drone-label.pfiers.net

Django-labeler, Britefury

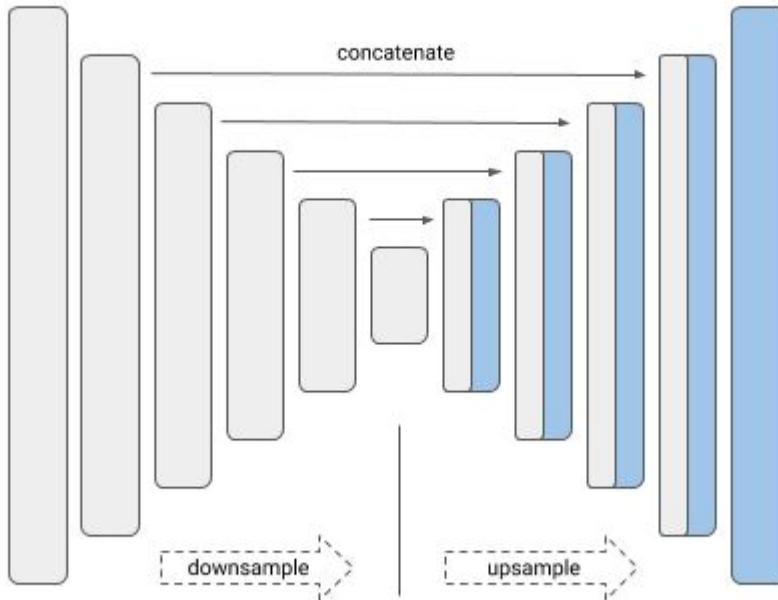
- Crowd sourced data
- Json to mask

# Augmentations

- Not enough data
- Randomizer
- Hue, flip, crop....



# Model

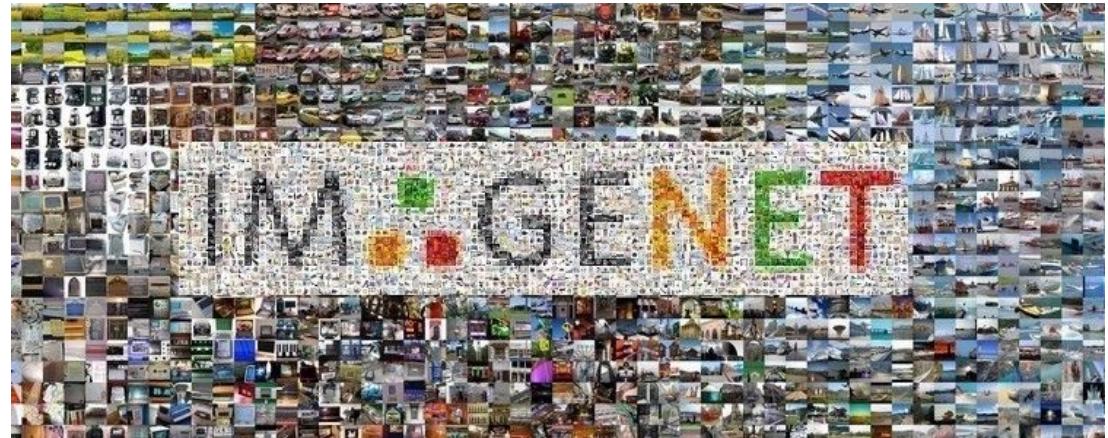


*Segmentation models*

- Unet
- EfficientNetB3
- Tensorflow (Keras)

# Transfer learning

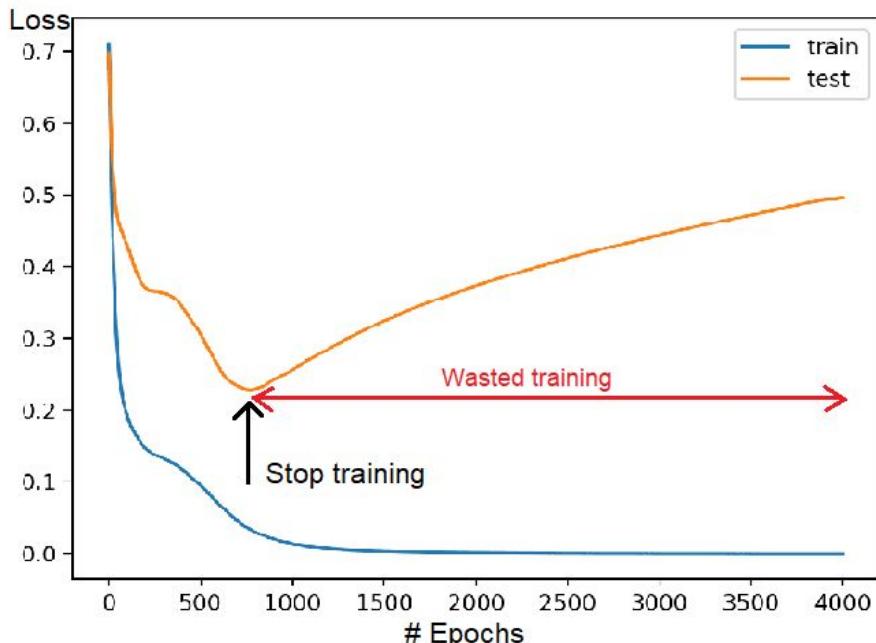
- Headstart
- 2012 ILSVRC ImageNet



*Imagenet*

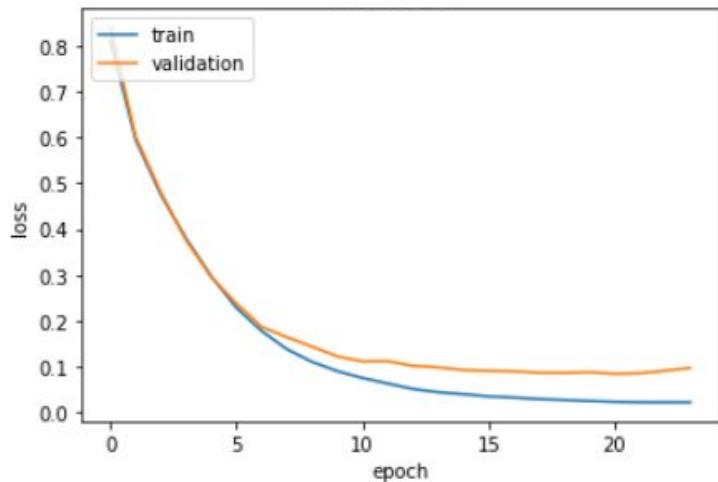
# Training

- 70% Training  
15% Validation  
15% Test
- Batch size = 16
- Early stopping
- Loss = Dice + Binary focal

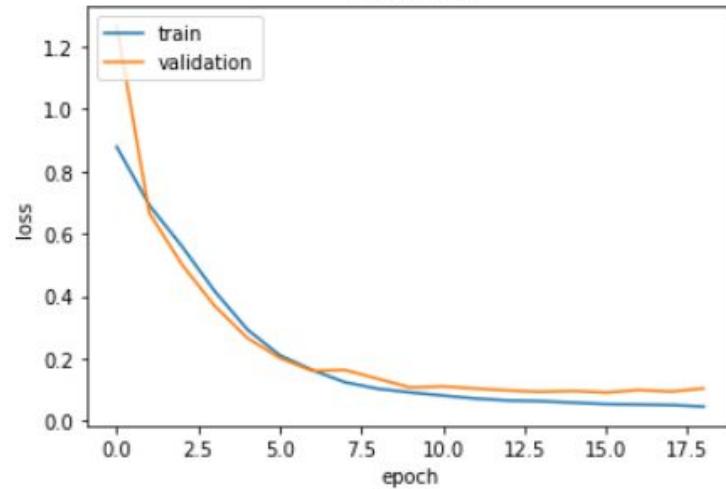


# Freiburg

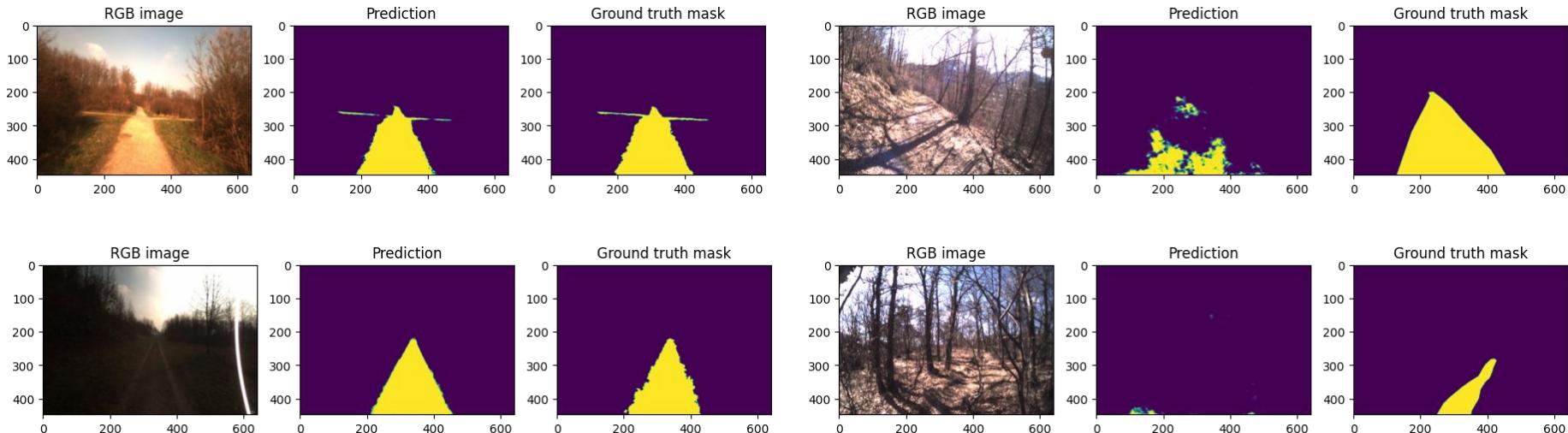
No aug



Aug

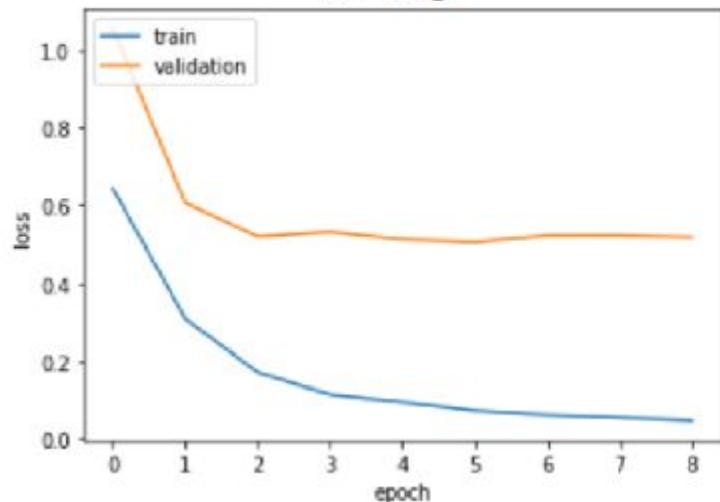


# Freiburg results

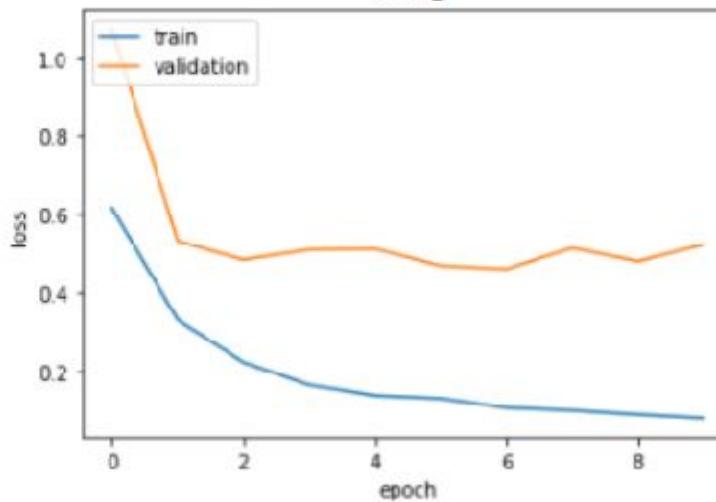


# Giusti

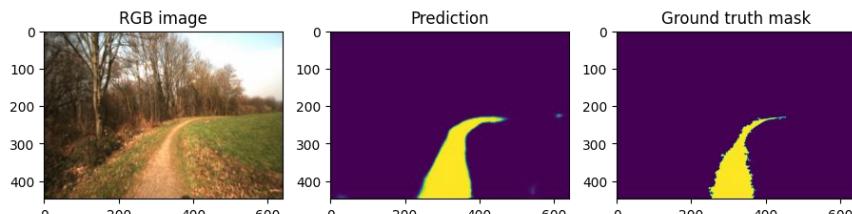
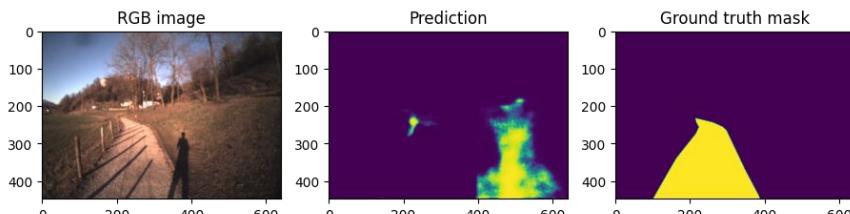
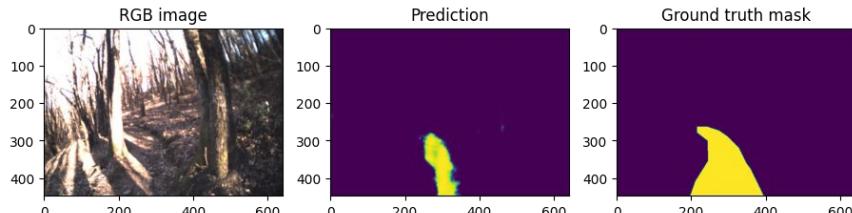
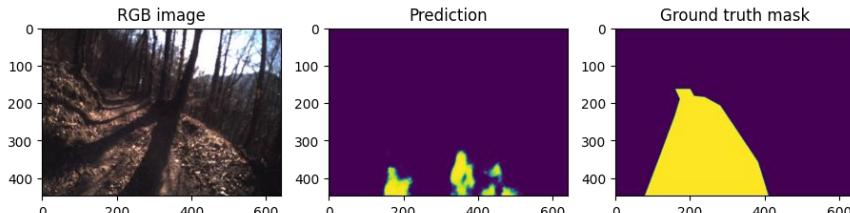
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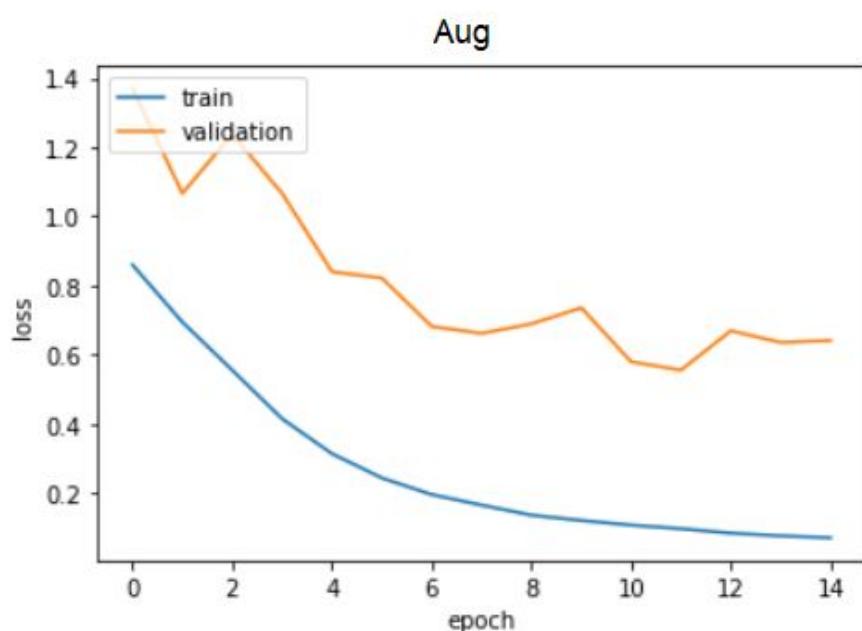
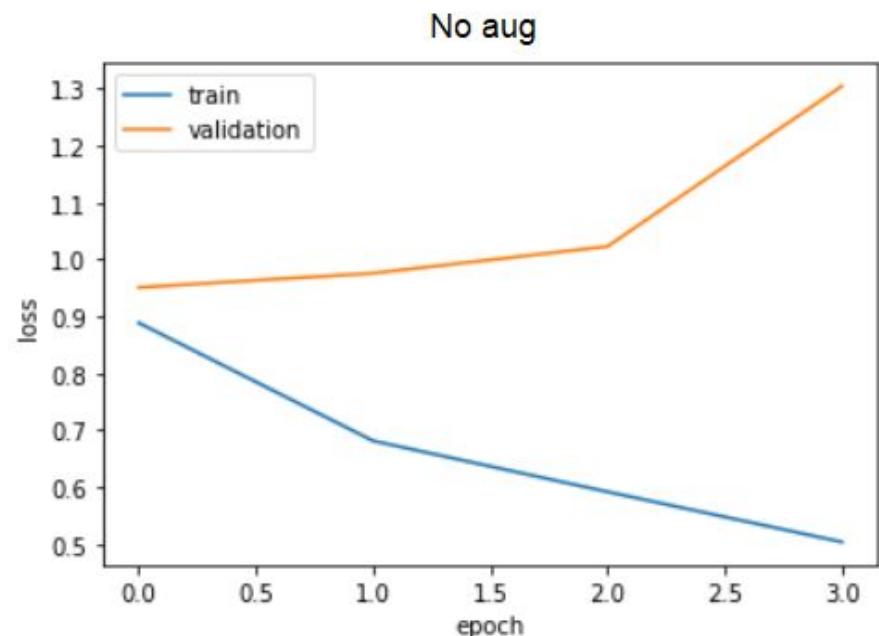
Aug



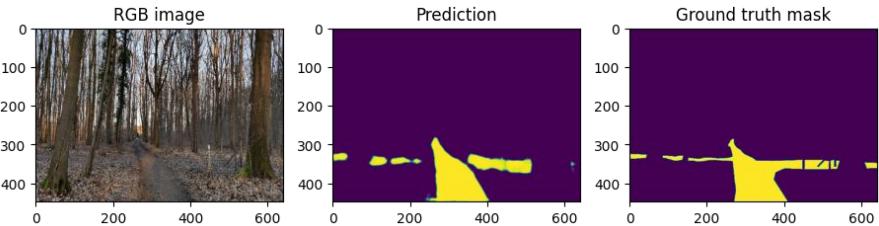
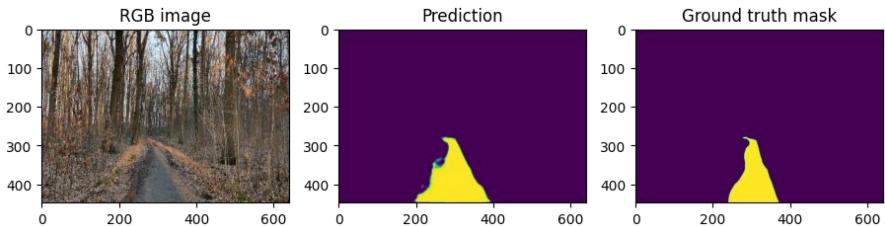
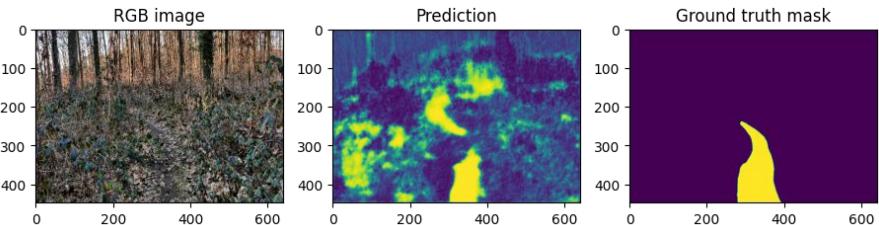
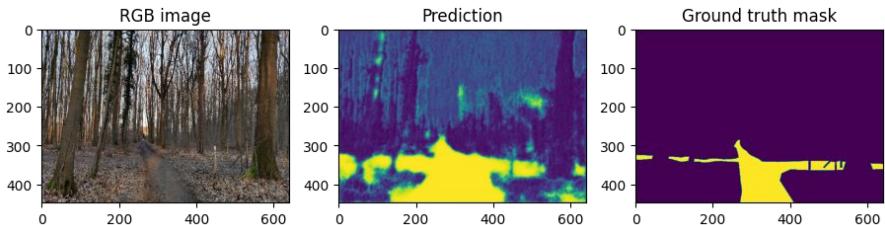
# Giusti results



# Steentjes

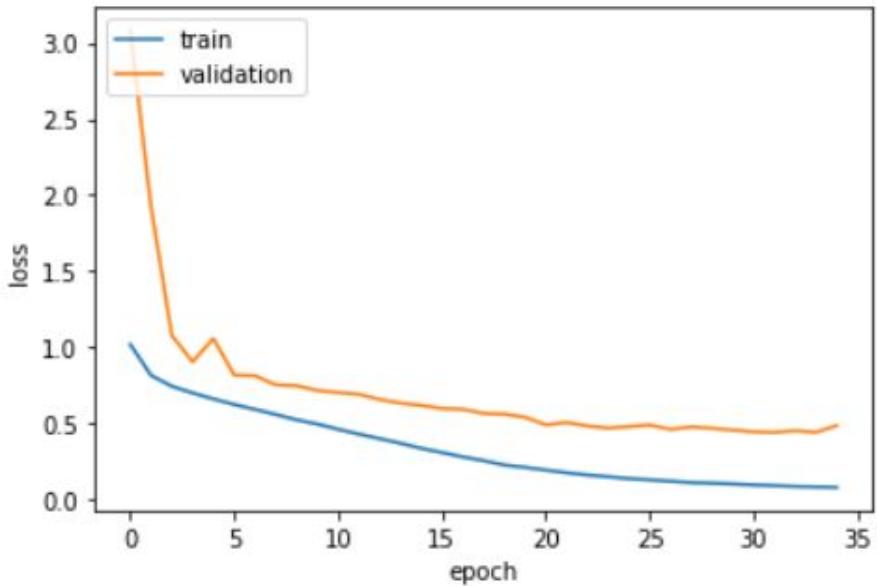


# Steentjes results

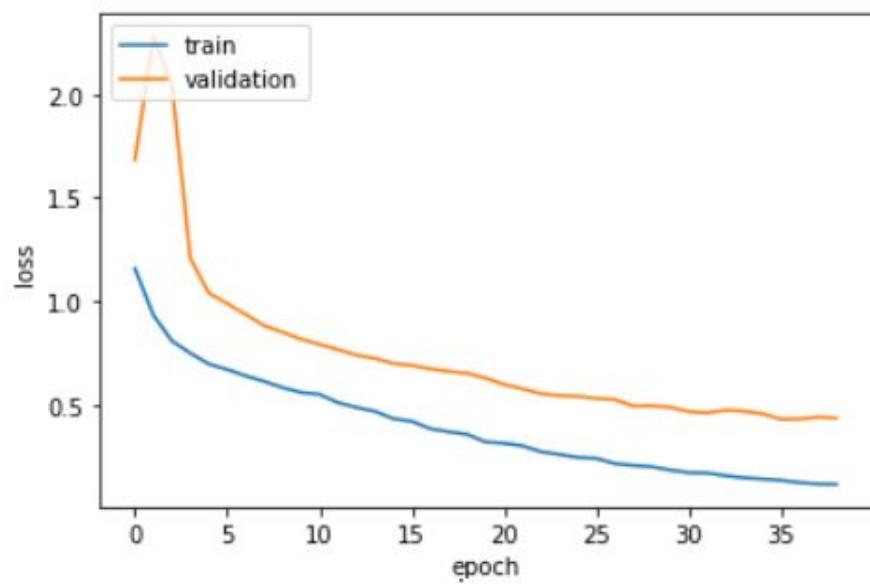


# Freiburg + Giusti + Steentjes

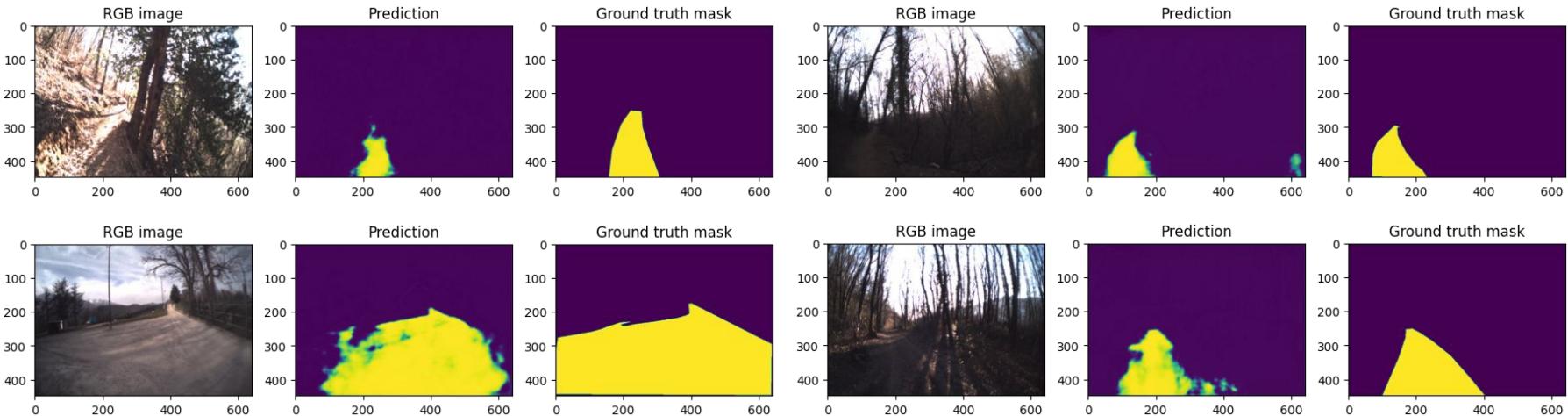
batch size 16



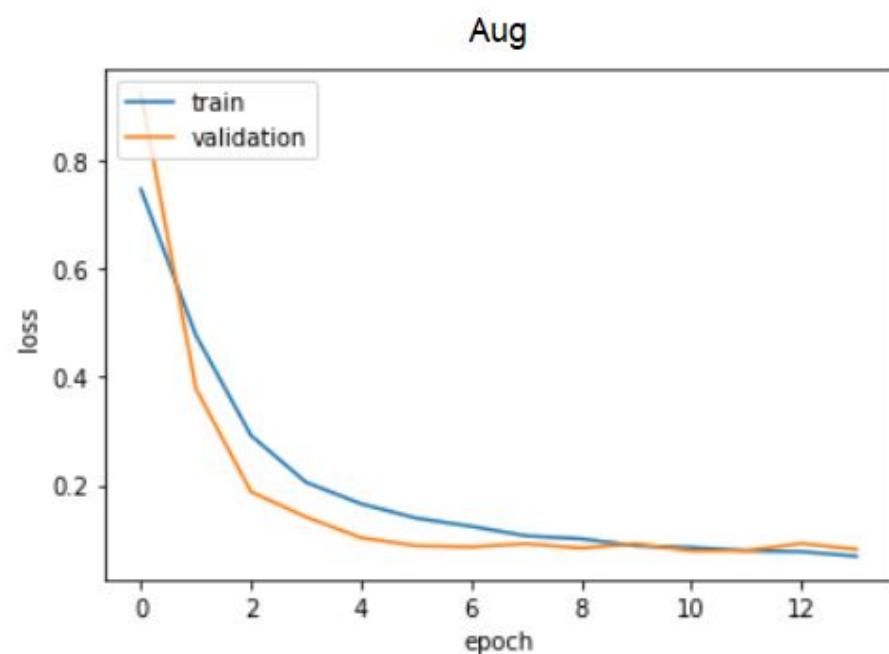
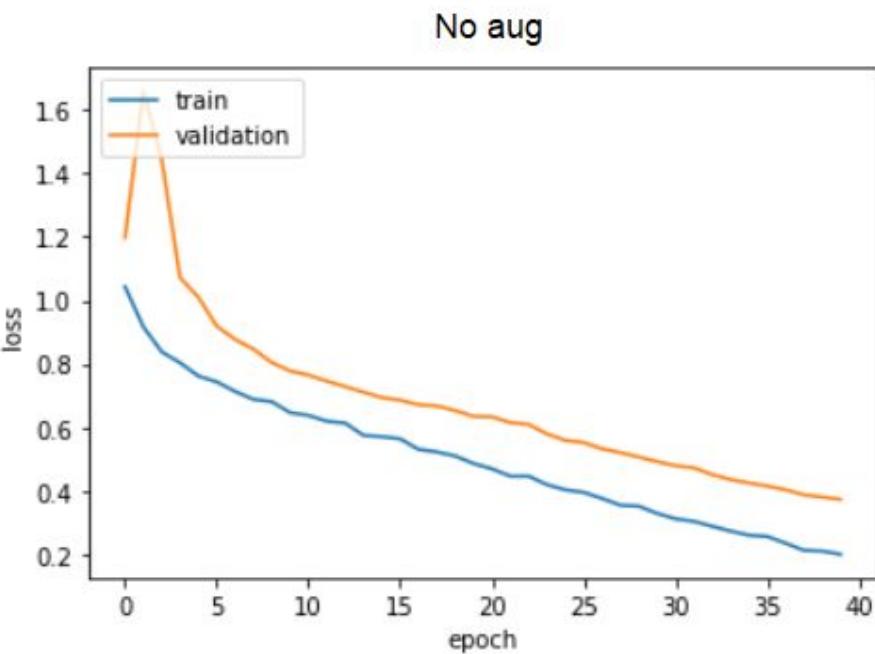
batch size 32



# Freiburg + Giusti + Steentjes results



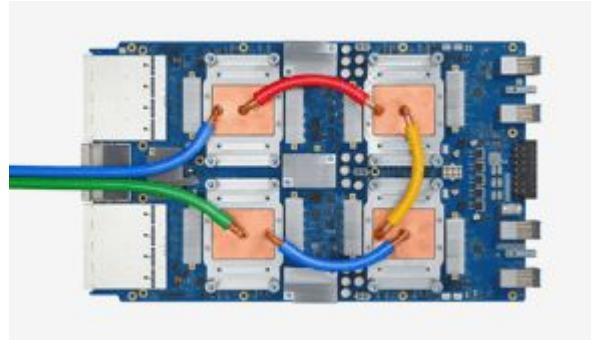
# Freiburg + Steentjes





# TPU

- Google Cloud Platform
- Machine Learning ASIC
- Can't run python code



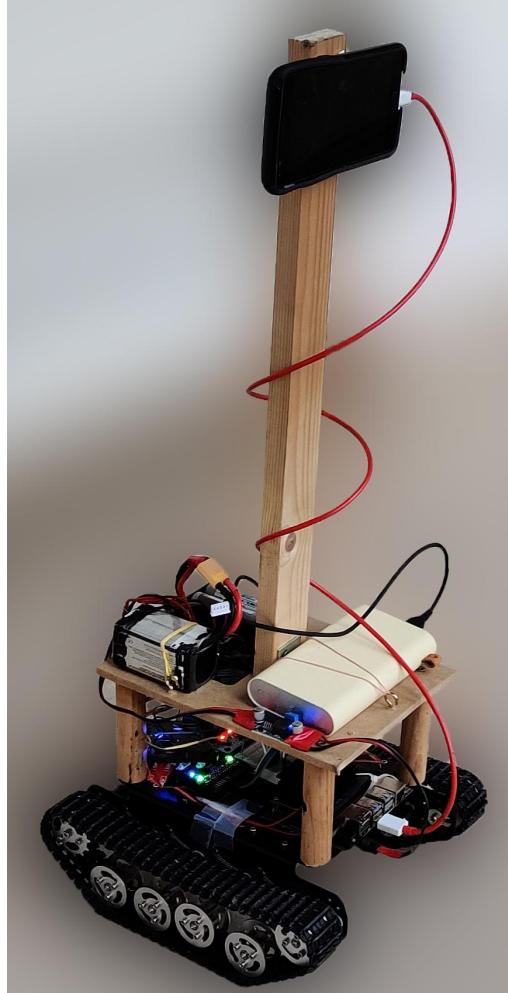
Google Cloud Platform

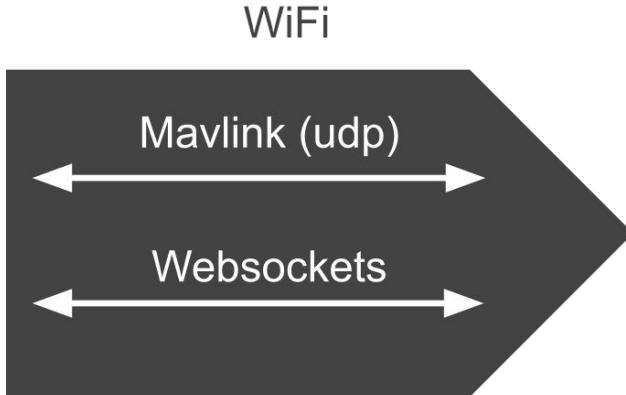


Google Cloud Platform

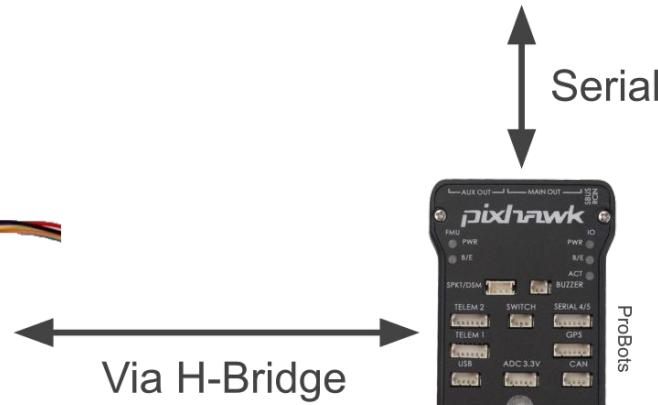
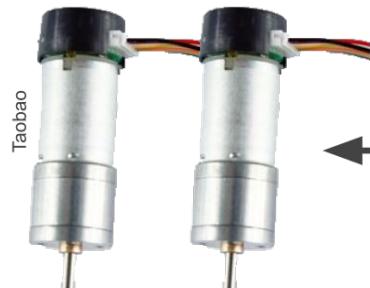
# Rover

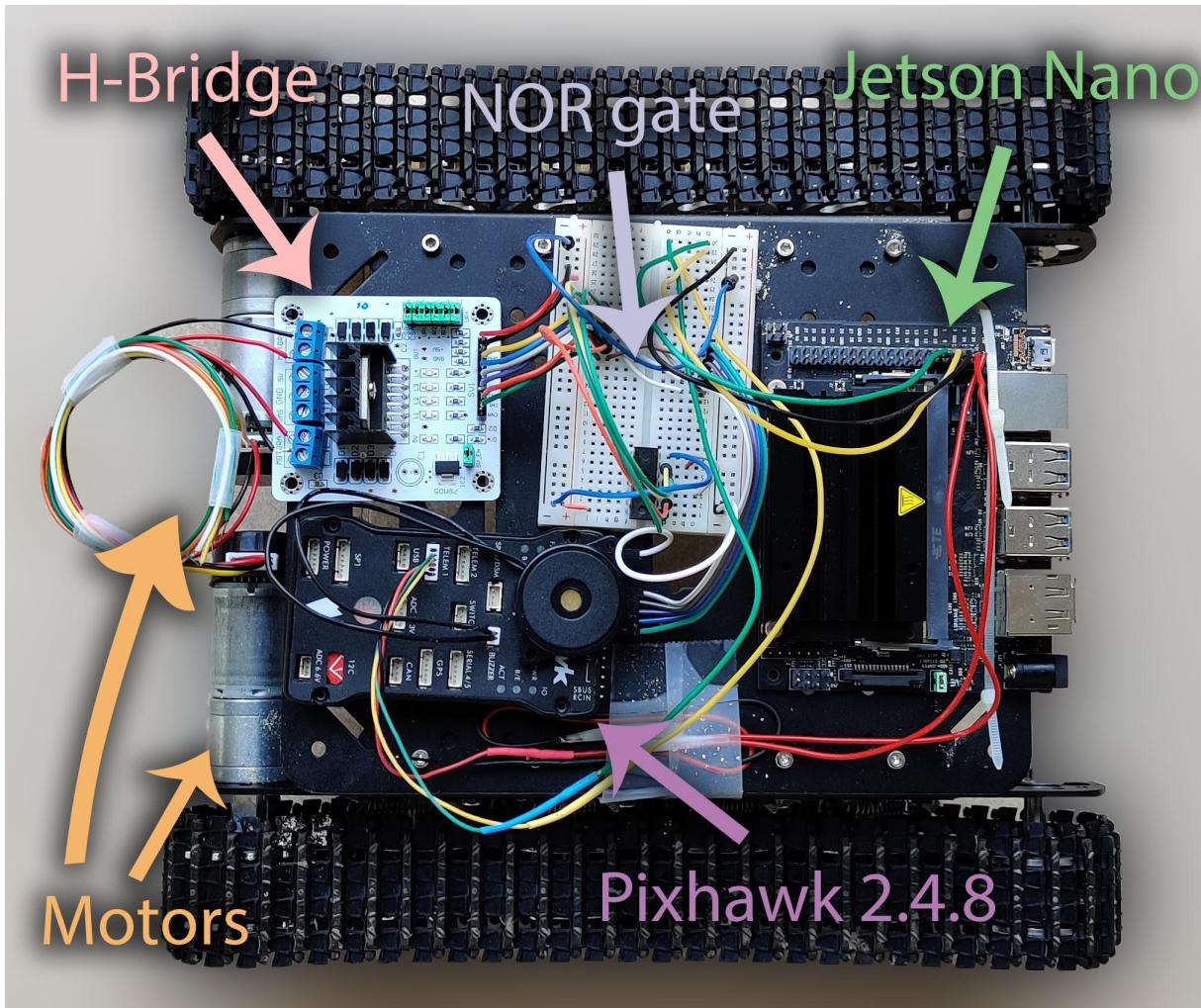
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Manual control





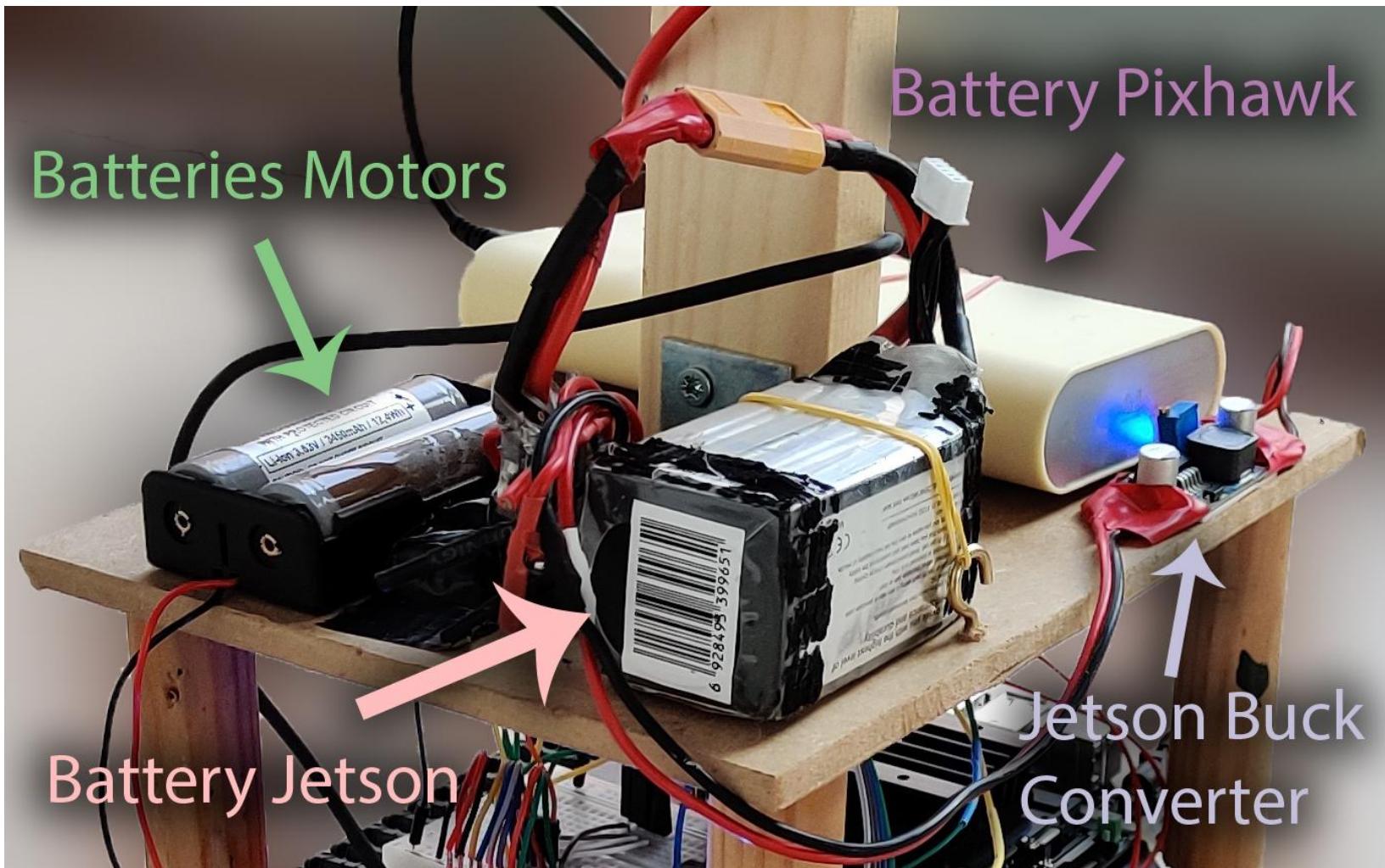




Image feed

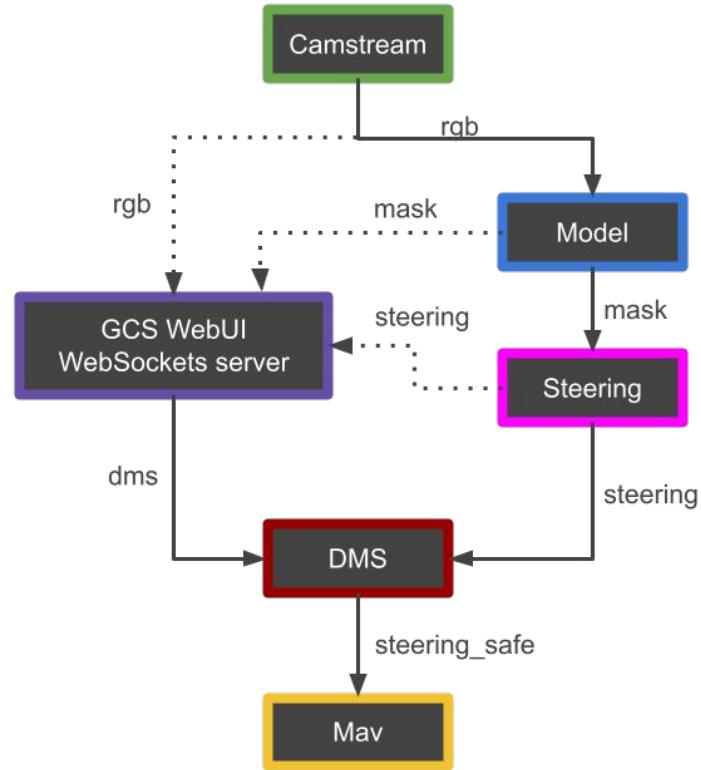


Control



Dead man's switch

# Functional Diagram ROS





# Conclusion

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# Further improvements

- On-drone inference
- More environments
- Autonomous decision making
- ...

# Applications

- Surveying
- Transport
- Remote assistance
- ...

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