

# Predicting forest volume growth using repeated airborne laser scanning (ALS), climate and soil data

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# Outline

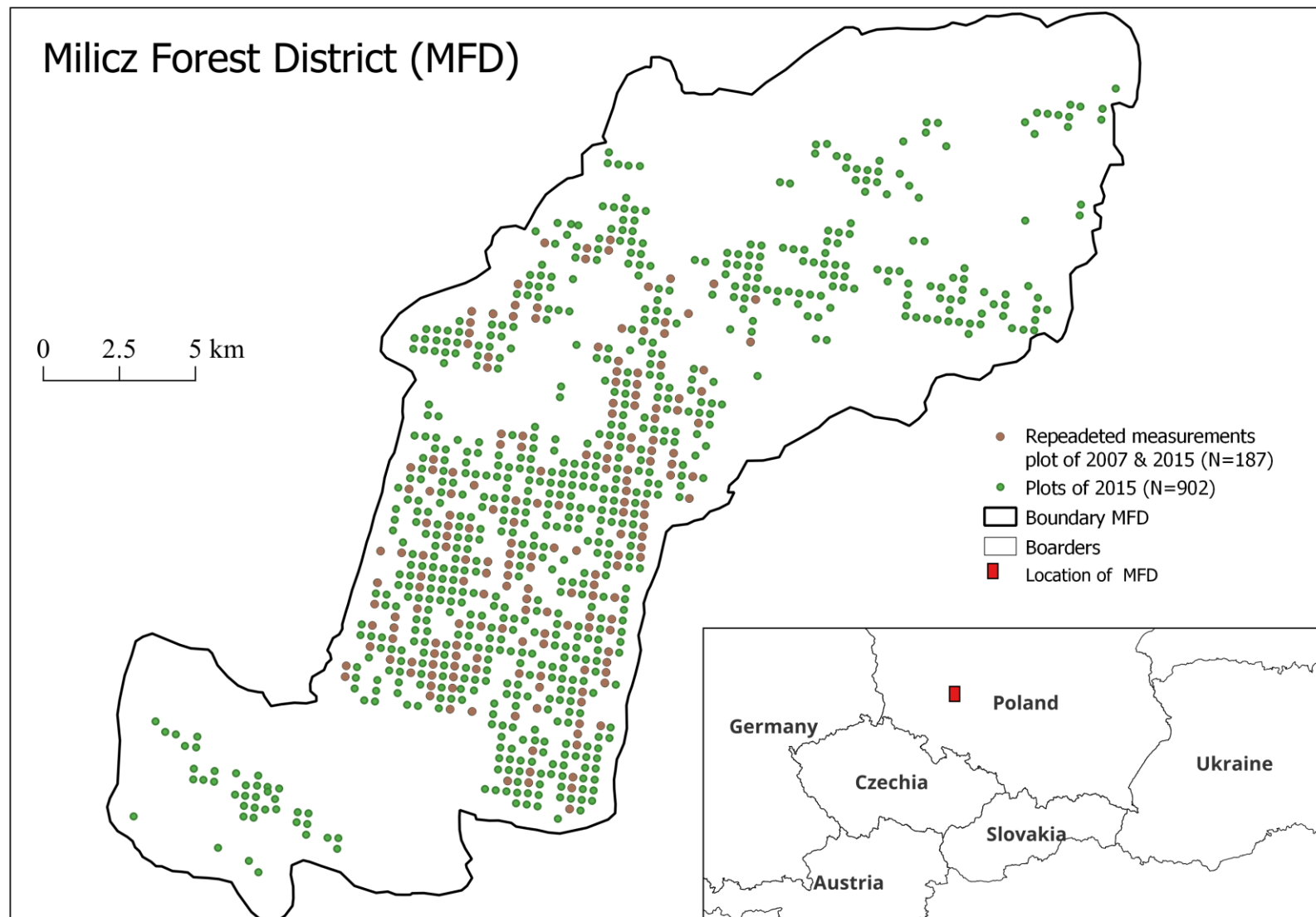


- Motivation
- Study area
- Variables and models
- Preliminary results
- Conclusion

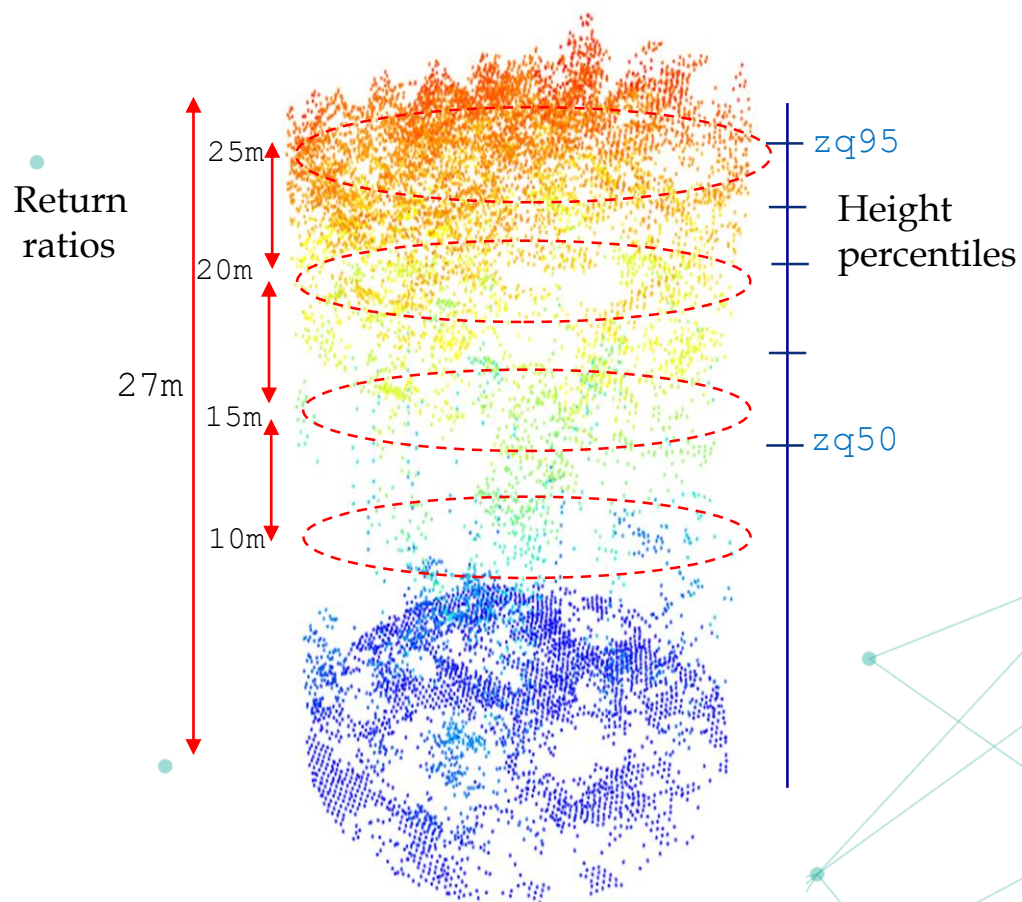
- ❖ Evaluate potential to improve growth volume estimates
- ❖ Compare growth and estimate change
- ❖ Evaluate model sensitivity to climate and site factors

# Study area - Milicz

Period:  
2007 and 2015



# Variables



## Climate

- seasonal
- annual
- growth indices

## Site factors

- Site type
- Site moisture

Organic carbon (soc)

Point cloud (ALS) variables



# Correlation

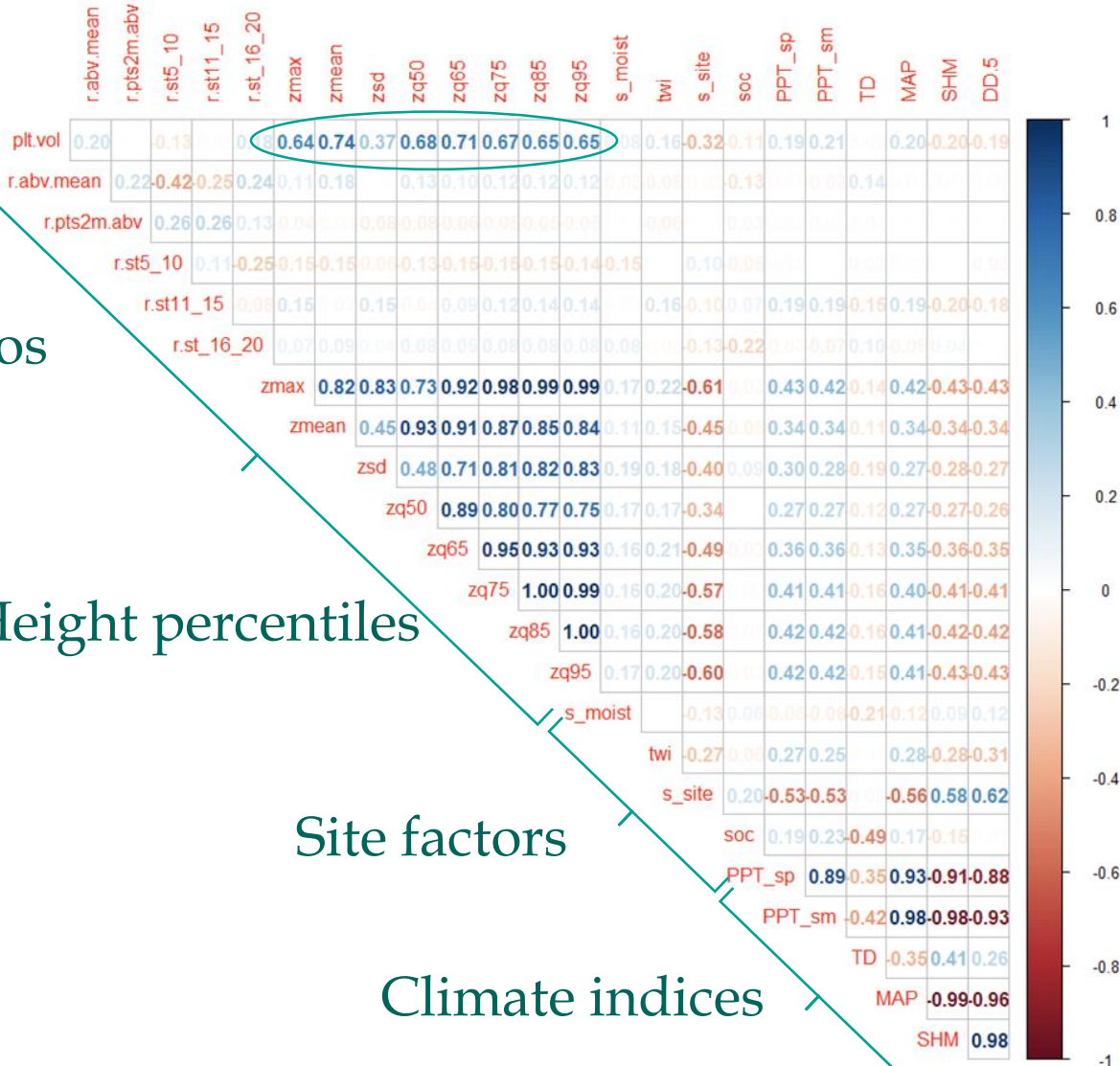


Return ratios

Height percentiles

Site factors

Climate indices

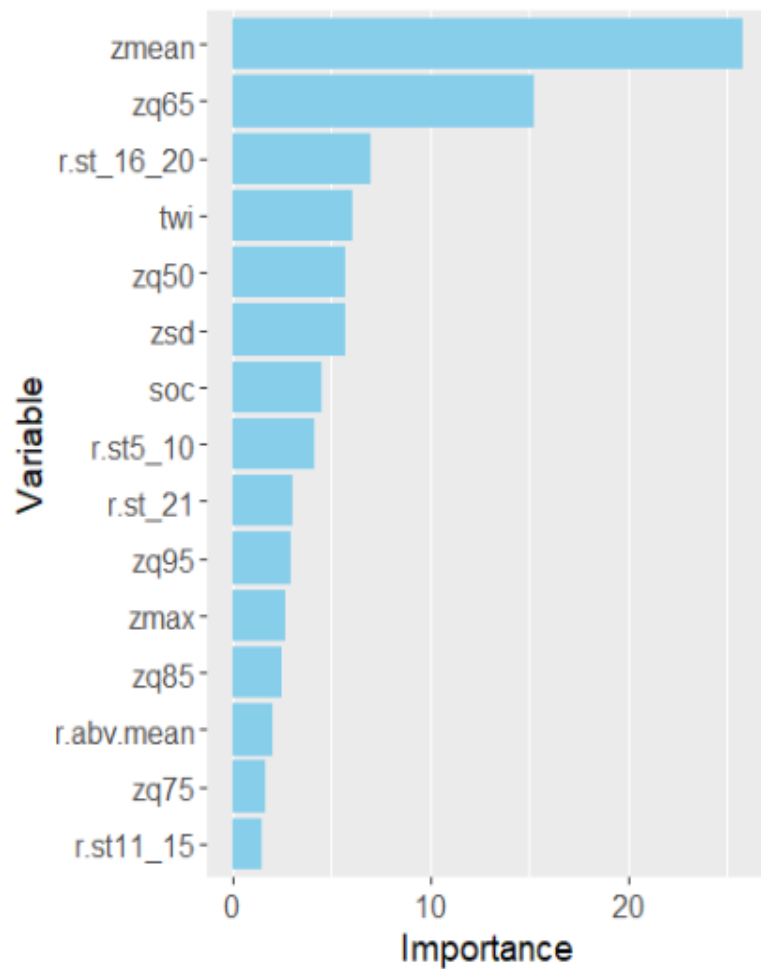




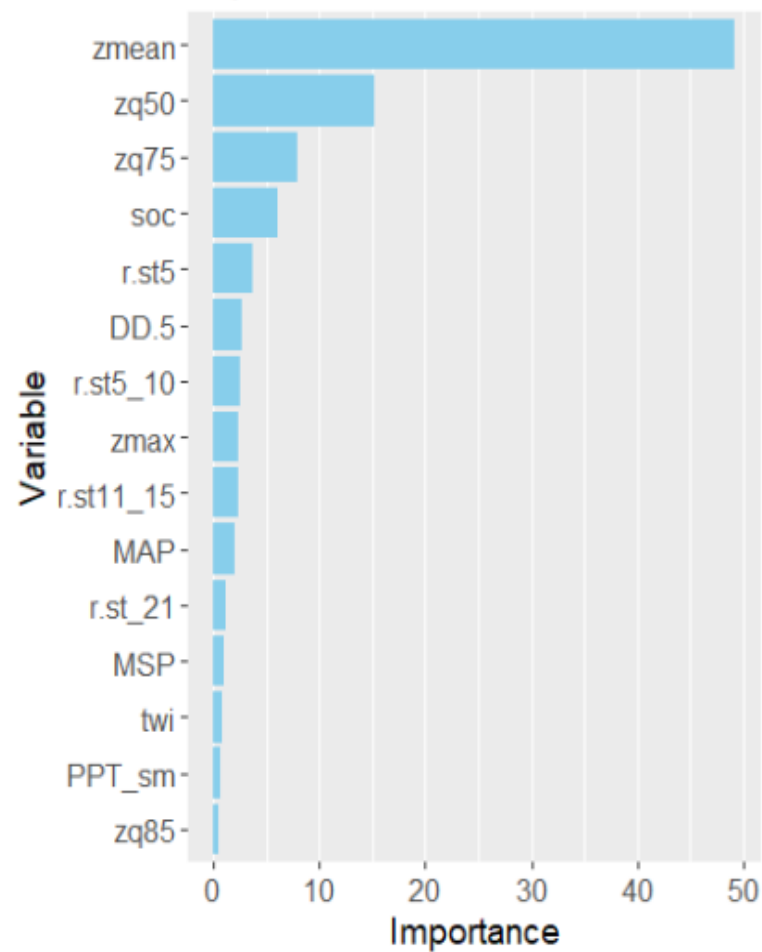
# Preliminary Results



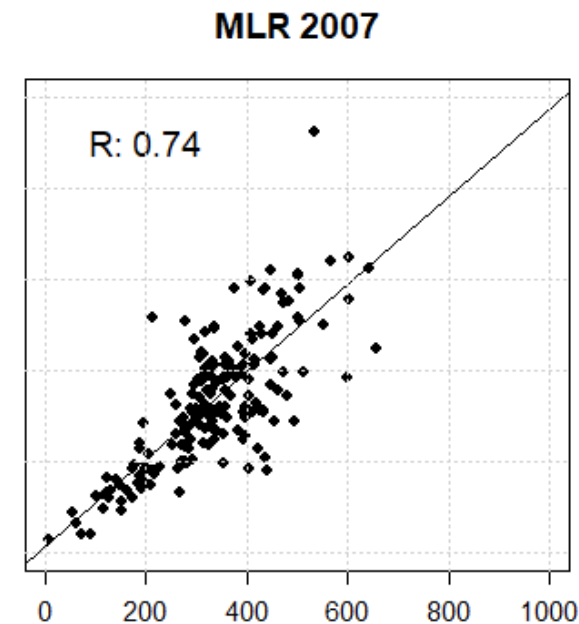
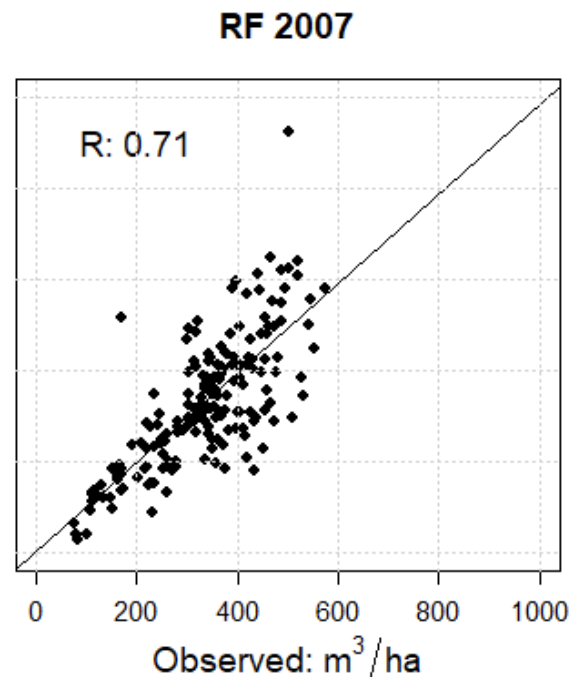
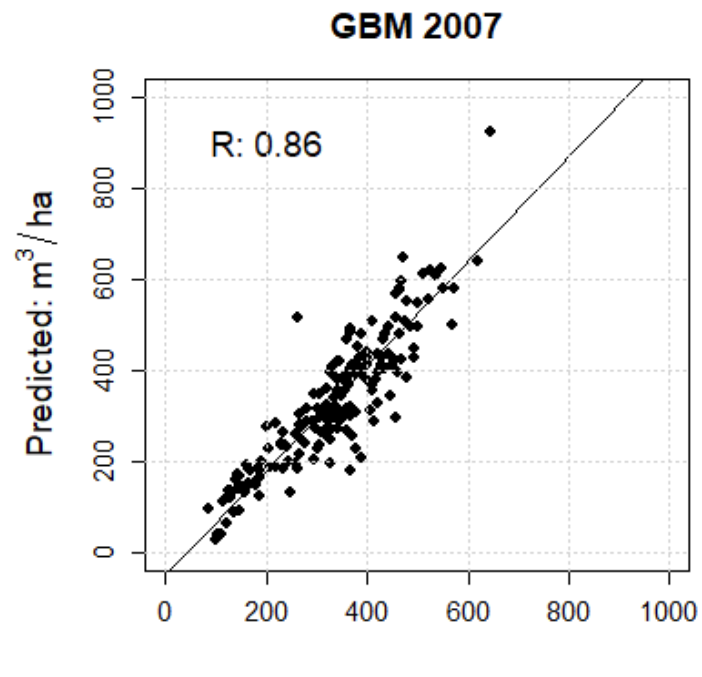
Top 15 Variable, GBM 2007



Top 15 Variable, GBM 2015



# Preliminary Results



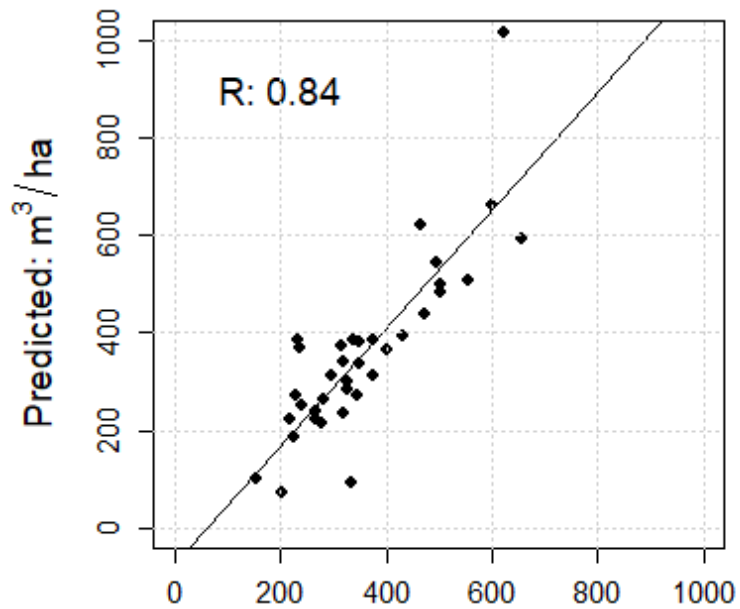
Model	R <sup>2</sup> sq	rRMSE(%)	Bias
Random forest	0.54	31	-5.31
Gradient boosting	0.53	32	-0.28
MLR	0.55	30	0.006

$$\text{Vol.2007} = 1013.5 + 12.22zq65 + 13.61zq95 - 20.41zsd + 100.08MAT - 29.12soc - 26.26s\_site + 10soc:s\_site$$

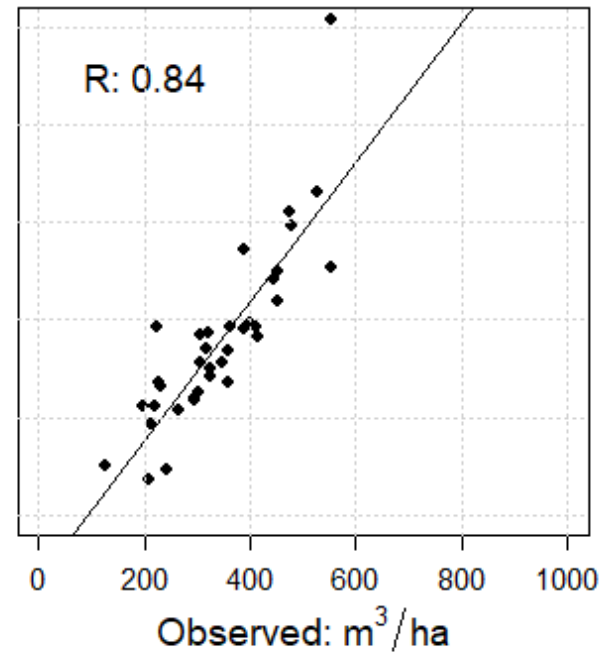


# Preliminary Results

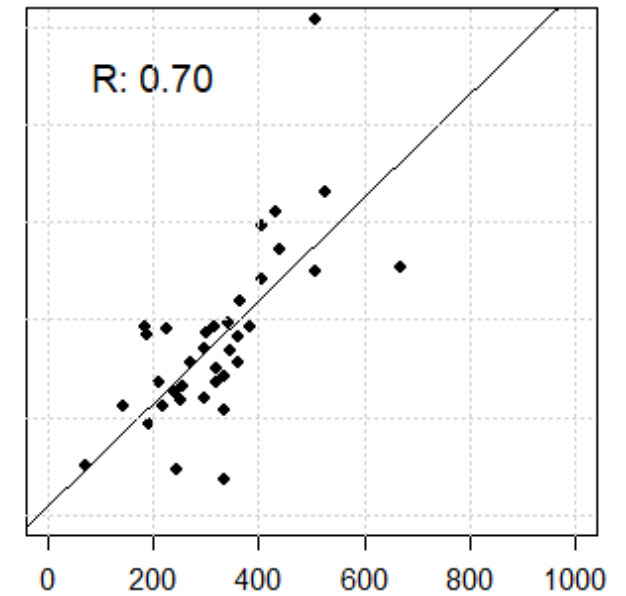
GBM 2015



RF 2015



MLR 2015



Model	Rsq	rRMSE(%)	Bias
Random forest	0.63	27	-0.99
Gradient boosting	0.55	28	1.13
MLR	0.48	30	-36.5

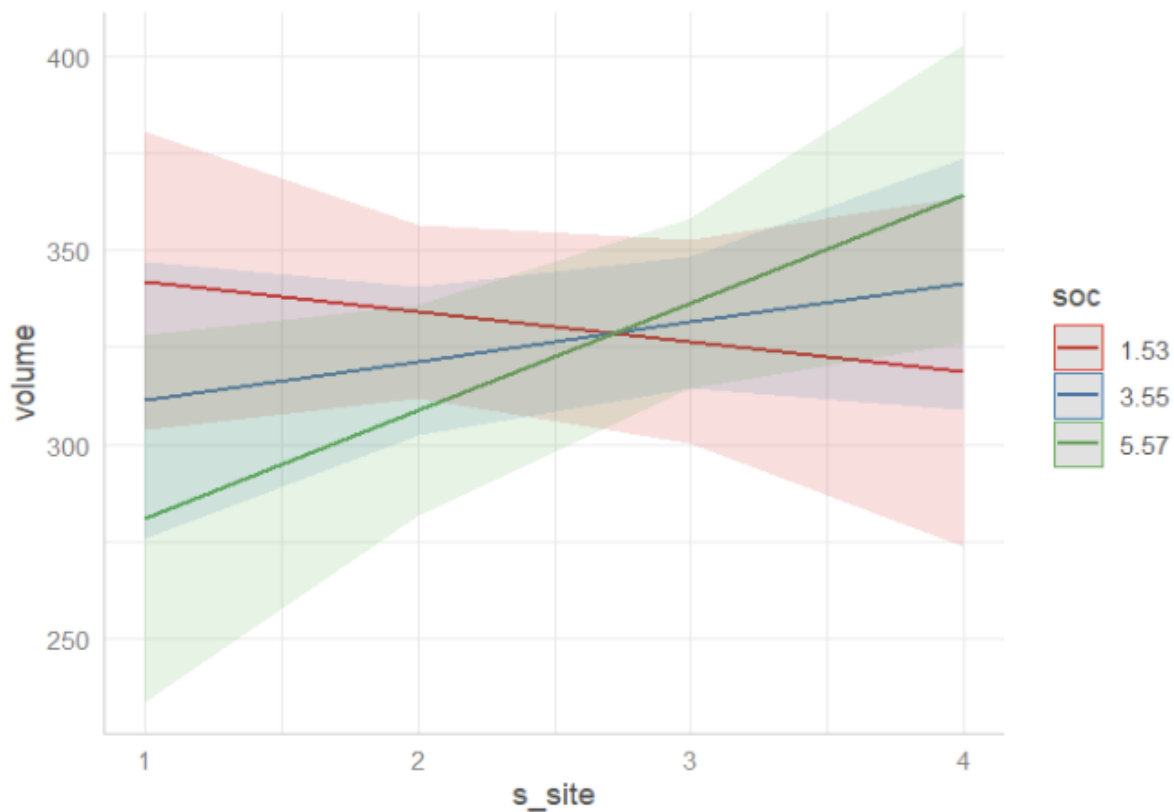
$$Vo1.2015 = -28.9 + 0.07s\_site + 0.07zq75 + 1.63MAT + 0.04MAP - 0.07soc$$



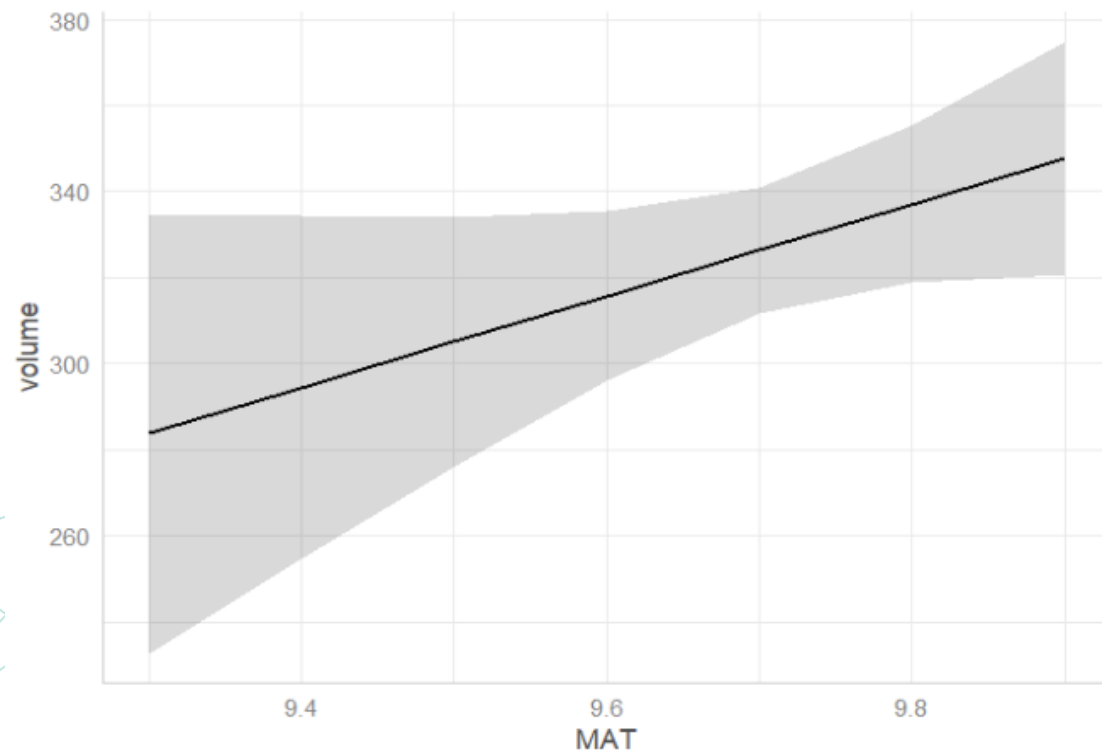
# Partial effects



Predicted values of volume



Predicted values of volume

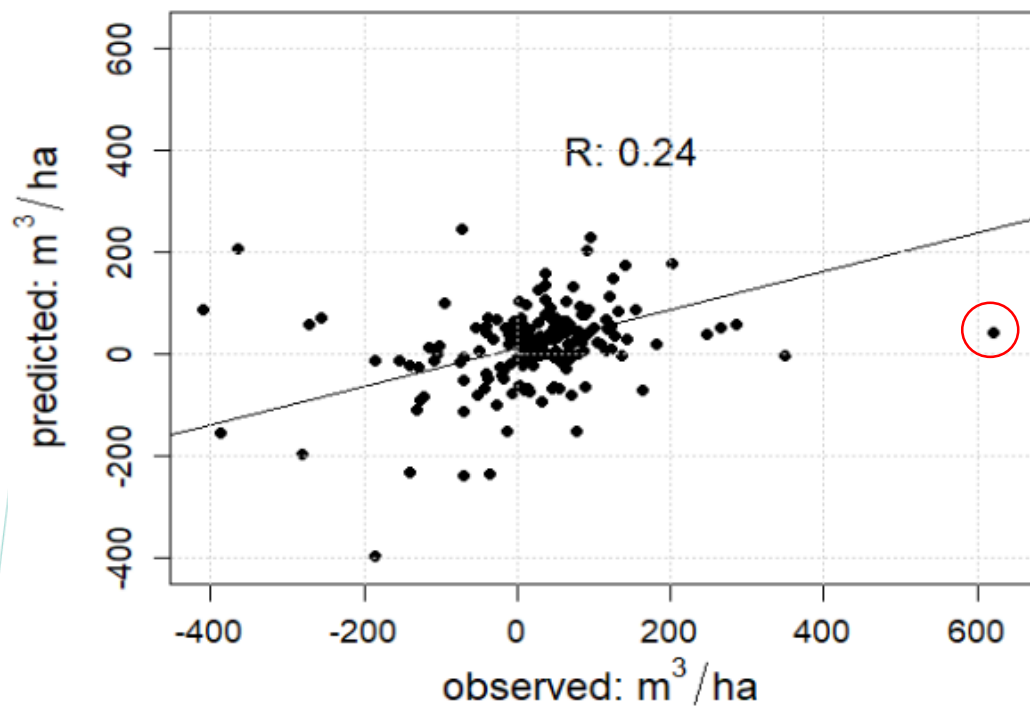




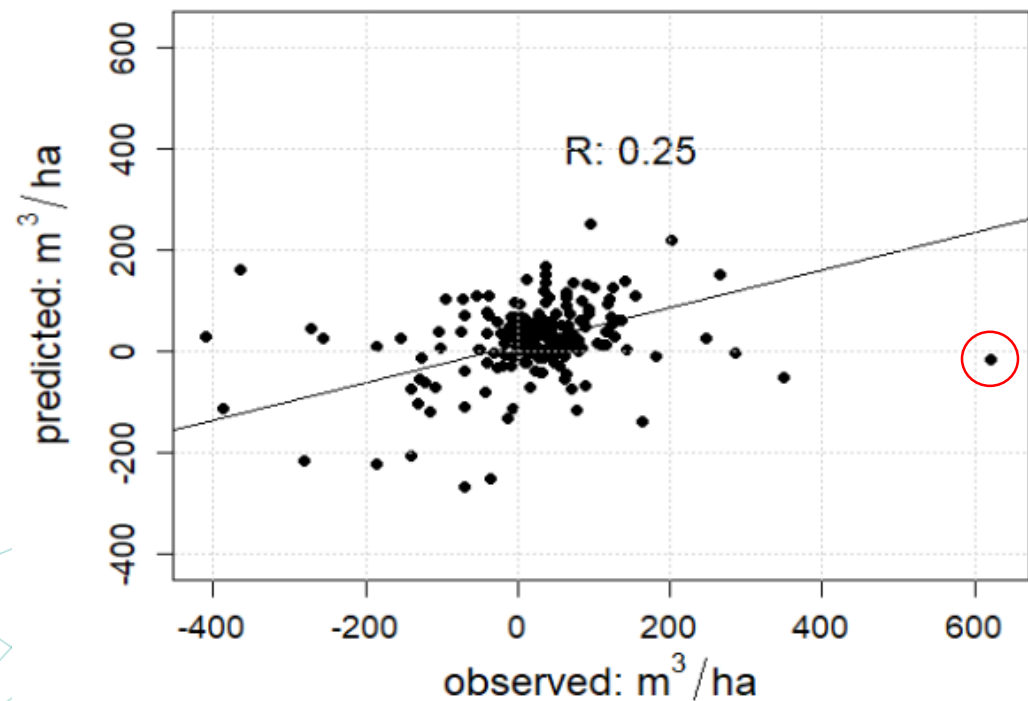
# Preliminary results

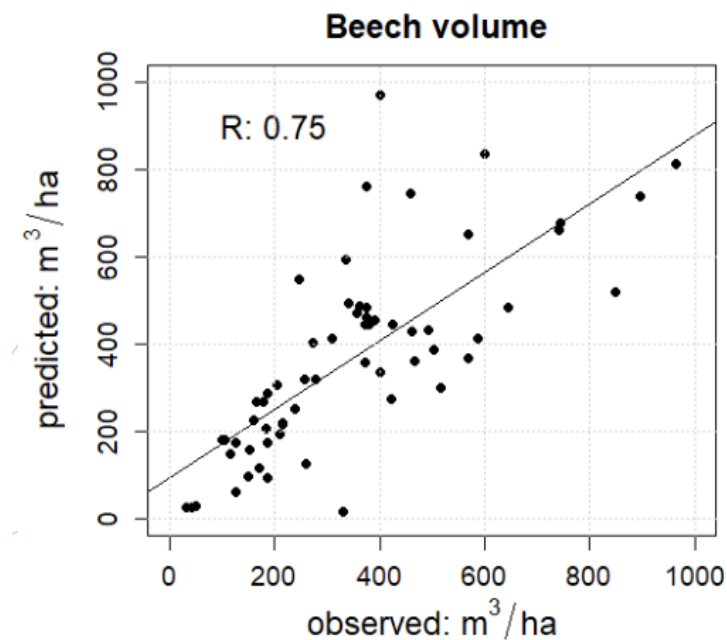
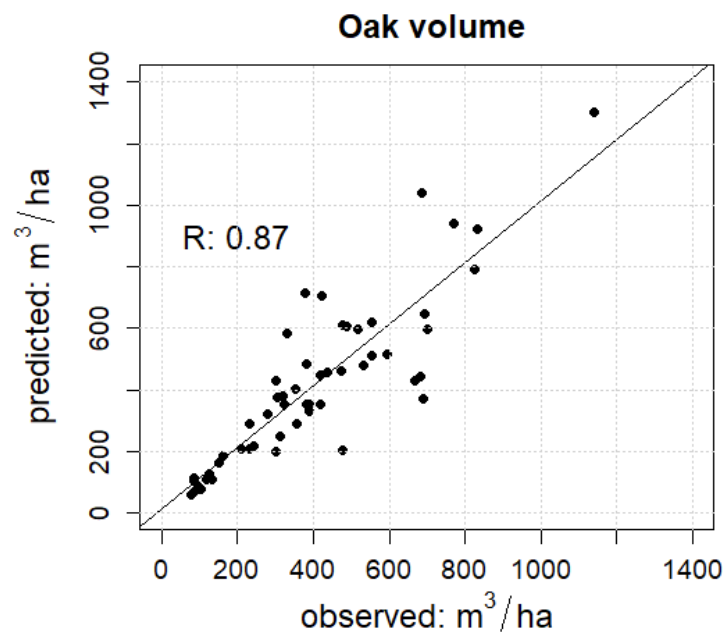
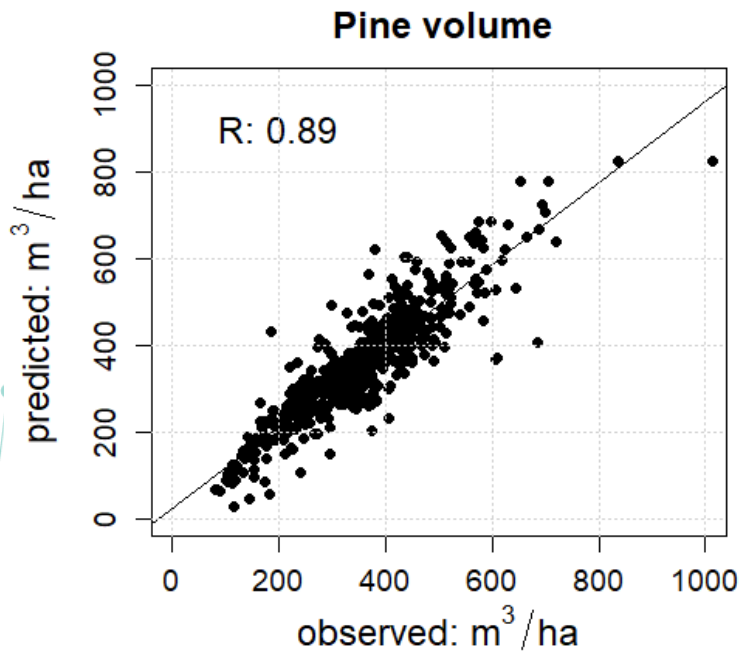


volume change compared (RF models)



volume change compared





Model	R2	rRMSE(%)	Bias
Pine -MLR (N=563)	0.80	16	-3.7
Oak -MLR (N= 53)	0.78	31	-13.65
Beech -MLR (N=61)	0.56	42	-19.7

$$\text{Pine\_vol} = 0.86 - 0.1zsd + 0.031zq50 + 0.41zq85 + -0.002zq85^2 - 0.21zq95 + 0.78MCMT - 0.032MAT + 0.1DD.5$$

# Conclusions

- Volume growth is largely controlled by vegetation structure.
- Site factor and climate contribution are small but equally important.

## Options for Improvement

- Model with microclimate data.
- Try mixed effects models.
- Aggregate variables into a composite indicator?

Thank you for your attention

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