

# Development of a grassland simulation model to support decision making on grassland use

Felix Nößler

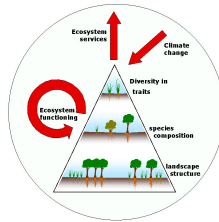
*YoMos meeting*

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Freie Universität



Berlin



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I ...

- studied Landscape Ecology and Conservation (Greifswald) and Ecology, Evolution and Conservation (Potsdam)

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I ...

- studied Landscape Ecology and Conservation (Greifswald) and Ecology, Evolution and Conservation (Potsdam)
- have knowledge in plant ecology (plants & bryophytes), simulation modelling and in (Bayesian) statistics

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I ...

- studied Landscape Ecology and Conservation (Greifswald) and Ecology, Evolution and Conservation (Potsdam)
- have knowledge in plant ecology (plants & bryophytes), simulation modelling and in (Bayesian) statistics
- am a doctoral student at the FU Berlin
- teach statistics with R, individual-based modelling, and a botany & ecology module

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# Research questions

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- How can the taxonomic and functional diversity of plants in grasslands be promoted and, at the same time, the loss of yield (forage production) be minimised?  
→ Model can be used as an evaluation tool for different measures

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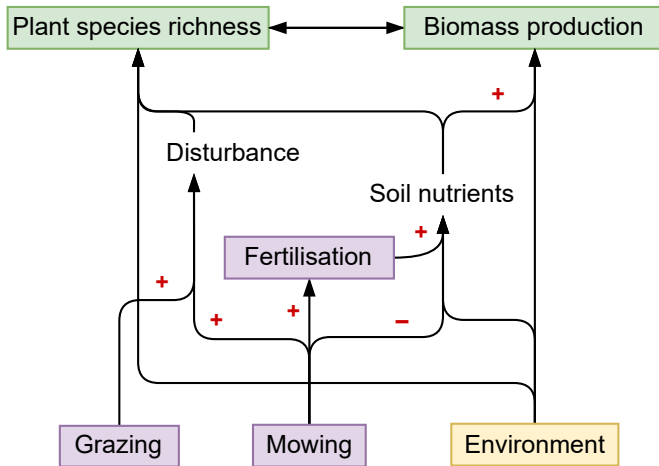
### Traits

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## Questions

- How can the taxonomic and functional diversity of plants in grasslands be promoted and, at the same time, the loss of yield (forage production) be minimised?  
→ Model can be used as an evaluation tool for different measures
- Does a higher taxonomic and functional plant diversity lead to a higher temporal stability of the forage production?

# Plant species richness and biomass production





# Model overview

- spatially explicit (meta-) community model of grassland plant species
- implementation with difference equations
- each species is characterized by ecophysiological traits

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# Model overview

- spatially explicit (meta-) community model of grassland plant species
- implementation with difference equations
- each species is characterized by ecophysiological traits
- temporal resolution: daily
- spatial resolution: per grassland (patch)

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# Model overview

- spatially explicit (meta-) community model of grassland plant species
- implementation with difference equations
- each species is characterized by ecophysiological traits
- temporal resolution: daily
- spatial resolution: per grassland (patch)

## State variables

- biomass of species  $i$  in patch  $x$
- soil water content of patch  $x$
- nutrients of patch  $x$

# Model overview

- spatially explicit (meta-) community model of grassland plant species
- implementation with difference equations
- each species is characterized by ecophysiological traits
- temporal resolution: daily
- spatial resolution: per grassland (patch)

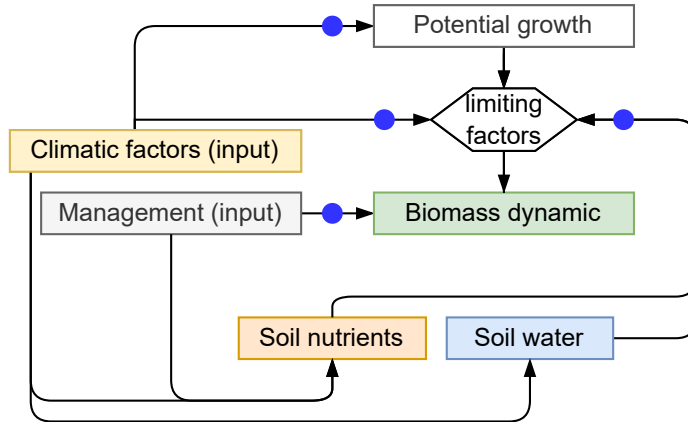
## State variables

- biomass of species  $i$  in patch  $x$
- soil water content of patch  $x$
- nutrients of patch  $x$

## Assumptions

- the vegetation is homogeneous within a patch
- no intraspecific trait variability and trait evolution/phenotypic plasticity

## Model overview



# Study site - Biodiversity exploratories

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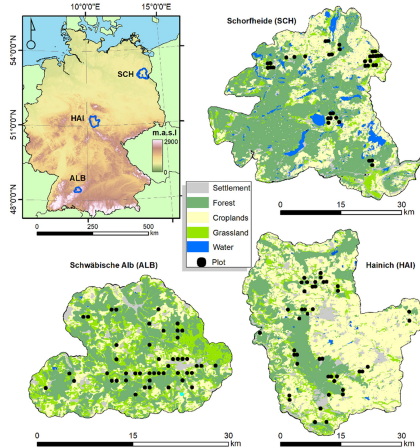
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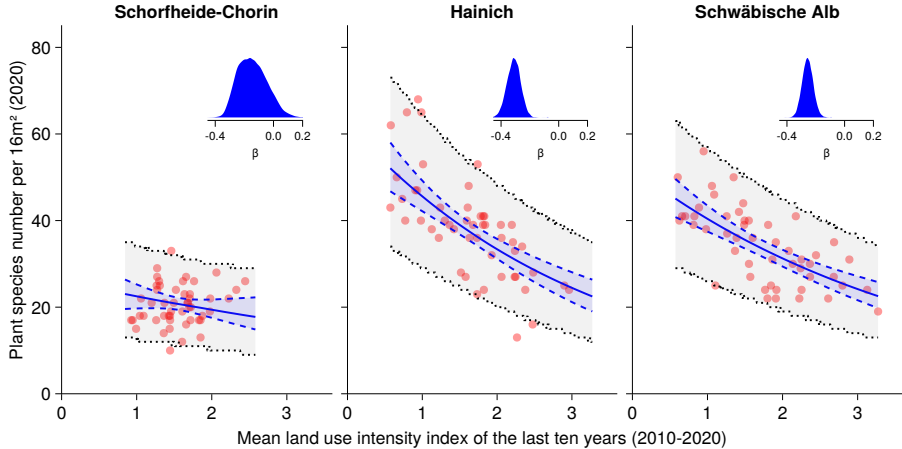
## Model showcase

## Questions



Muro et al. (2022)

# Study site - Biodiversity exploratories



● data (total n = 150) ■ posterior ..... 95 % data - - 95 % expected value

# Species-specific response - Plant traits

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## Questions

### Radiation use efficiency

- Specific leaf area ↑
- Plant height ↑

### Water and nutrient use efficiency

- Specific leaf area ↓
- Root surface area / aboveground biomass ↑
- Mycorrhizal colonisation ↑



# Species-specific response - Plant traits

## Radiation use efficiency

- Specific leaf area ↑
- Plant height ↑

## Water and nutrient use efficiency

- Specific leaf area ↓
- Root surface area / aboveground biomass ↑
- Mycorrhizal colonisation ↑

## Senescence rate

- Specific leaf area ↓

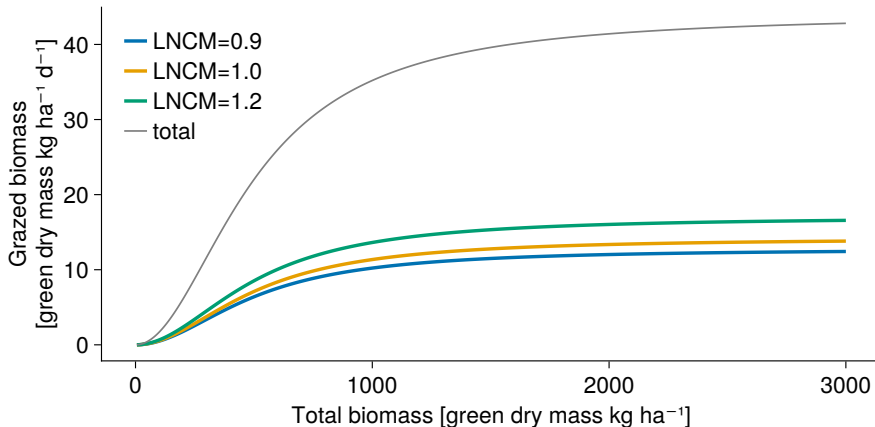
## Grazing and trampling

- Leaf nitrogen content ↓
- Plant height ↓
- Leaf area ↓

## Mowing

- Plant height ↓

## Species-specific response - Example



# Model parametrisation

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for fitting internal parameters:

- observed time series of climatic and management variables are used

for running scenarios:

- random samples from fitted time series models of the climate data are used
- management options can be varied
- plant species number can be varied

# Plant traits - Gaussian mixture model

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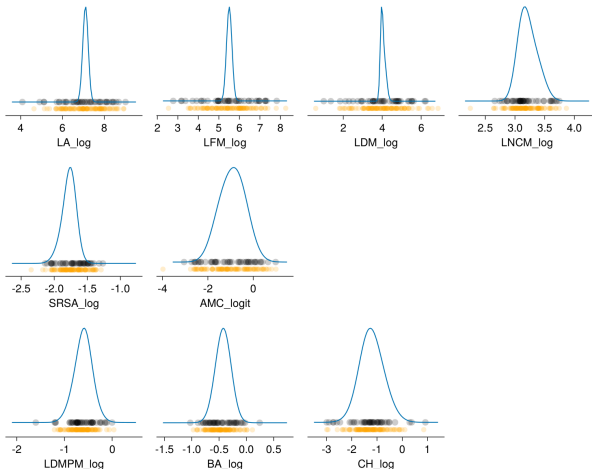
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- 46 species with values for all traits (out of 138 of the three exploratories)
- Gaussian mixture model with full covariance matrix and transformed data
  - black: data
  - orange: generated samples
  - blue line: marginal likelihood

# Plant traits - Gaussian mixture model

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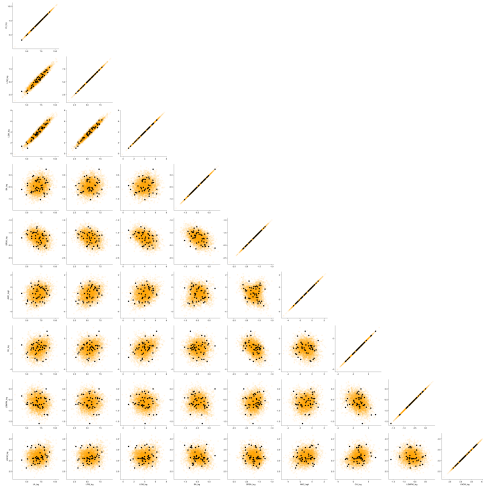
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- correlation structure between the traits
  - black: data
  - orange: generated samples

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- Model is developed as a *Julia* package:  
<https://github.com/FelixNoessler/RegionalGrasslandSim.jl>
- documentation (WIP):  
<https://felixnoessler.github.io/RegionalGrasslandSim.jl>

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- documentation (WIP):  
<https://felixnoessler.github.io/RegionalGrasslandSim.jl>
  - basic local model is working
  - nutrient sub-model has to be adjusted

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Thanks for listening! Do you have questions or remarks?



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Muro, J., A. Linstädter, P. Magdon, S. Wöllauer, F. A. Männer, L.-M. Schwarz, G. Ghazaryan, J. Schultz, Z. Malenovský, and O. Dubovyk (2022). “Predicting plant biomass and species richness in temperate grasslands across regions, time, and land management with remote sensing and deep learning”. In: *Remote Sensing of Environment* 282, p. 113262. DOI: [10.1016/j.rse.2022.113262](https://doi.org/10.1016/j.rse.2022.113262).