

An FSPM of barley including the allocation and effects of carbon, nitrogen and gibberellic acid



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GÖTTINGEN



WAGENINGEN UR

For quality of life

Outline

Introduction

- Motivation

- Overview

Model description

- Sub-models

- Allocation of carbon and nitrogen

- ODE framework

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- Model run

- Simulation results

Summary

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- ▶ **Simulation of crop response to nitrogen fertilisation**
- ▶ Influence of nutrient budget on the rate of leaf and tiller appearance (to a lesser extent than temperature and day length)
- ▶ Relations between carbon and (soil) nitrogen (nitrogen uptake, photosynthesis)
- ▶ Crop yield determined by nitrogen availability
- ▶ Optimisation of nitrogen fertilisation to increase crop yield in cereals and to decrease costs and environmental pollution

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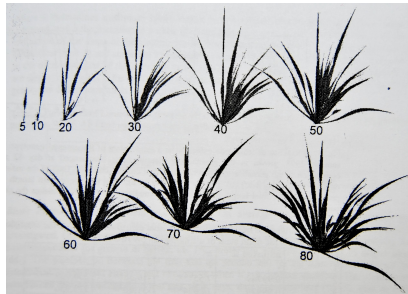
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FSPM of winter barley (*Hordeum vulgare* L.) (L-studio)

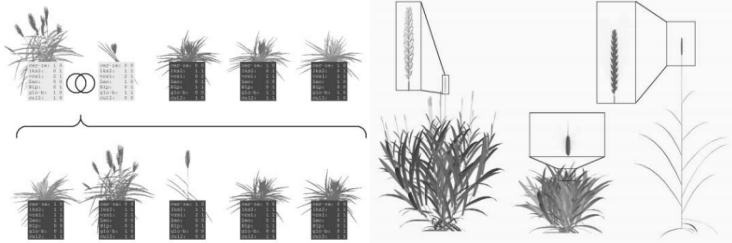
- ▶ Vegetative growth (Buck-Sorlin 2002¹)



¹L-system model of the vegetative growth of winter barley (*Hordeum vulgare* L.). In: Polani, D., Kim, J., and Martinetz, T., editors. Fifth German workshop on artificial life: *Abstracting and synthesizing the principles of living systems*, March 18-20, 2002, Lübeck, Germany. Akad. Verl.-Ges. Aka, Berlin, 53-64.

FSPM of winter barley (*Hordeum vulgare* L.) (GroIMP)

- Breeding, genetic control, hormonal regulation of internode elongation (Buck-Sorlin et al. 2005², 2007³)



²Barley morphology, genetics and hormonal regulation of internode elongation modelled by a relational growth grammar. *New Phytologist*, 166 (3): 859-867.

³A grammar-based model of barley including virtual breeding, genetic control and a hormonal metabolic network. In Vos, J., Marcelis, L.F.M., de Visser, P.H.B., Struik, P.C., and Evers, J.B., editors. *Functional-Structural Plant Modelling in Crop Production*, volume 22 of Wageningen UR Frontis Series, chapter 21, pages 243-252. Springer, 1 edition.

FSPM of winter barley (*Hordeum vulgare* L.) (GroIMP)

- Gibberellic acid signal transduction, radiation and shading (Buck-Sorlin et al. 2008⁴)



⁴A rule-based model of barley morphogenesis, with special respect to shading and gibberellic acid signal transduction. *Annals of Botany*, 101 (8): 1109–1123.

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Model organisation

- ▶ Model organised in sub-models / modules:
 - ▶ Morphology (vegetative and generative part)
 - ▶ Genetics
 - ▶ Hormonal control
 - ▶ Radiation and shading
 - ▶ Global parameters (e.g., environment)
 - ▶ Carbon (C) and nitrogen (N) partitioning

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Components of the C and N sub-model

- ▶ Partitioning of substrates between shoot and root (Johnson et al. 1985⁵, Thornley et al. 1989⁶)
 - ▶ Compartment-based model of crop response to light, temperature and nitrogen
- ▶ Partitioning within the shoot (Marcelis 1996⁷, Yin et al. 2003⁸)
 - ▶ Sink strength concept

⁵Dynamic model of the response of a vegetative grass crop to light, temperature and nitrogen. *Plant, Cell & Environment*, 8(7):485-499.

⁶A model of nitrogen flows in grassland. *Plant, Cell & Environment*, 12(9):863-886.

⁷Sink strength as a determinant of dry matter partitioning in the whole plant. *Journal of Experimental Botany*, 47 (Special Issue), 1281-1291.

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Partitioning between shoot and root - submodels (1)

- ▶ Light interception (radiation model of GroIMP)
- ▶ Photosynthesis model
 - ▶ 4 different models tested: not N-sensitive (Thornley⁹, LeafC3¹⁰), N-sensitive (Thornley¹¹, LeafC3-N¹²)

⁹Thornley, J.H.M., Johnson, I.R. (1990): *Plant and crop modelling: A mathematical approach to plant and crop physiology*. Clarendon press, Oxford.

¹⁰Nikolov, N.T., Massman, W.J., Schoettle, A.W. (1995): Coupling biochemical and biophysical processes at the leaf level: an equilibrium photosynthesis model for leaves of C3 plants. *Ecological Modelling*, 80(2- 3):205-235.

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Partitioning between shoot and root - submodels (2)

- ▶ Nitrogen uptake, soil nitrogen
- ▶ Growth, partitioning
 - ▶ Shoot: lamina, sheath & stem
- ▶ Substrate utilization, respiration
- ▶ Senescence, recycling

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Partitioning between shoot and root - submodels (3)

- ▶ Submodels dependent on environment
- ▶ Climate data obtained for period of 288 days:
1.10.1998 - 15.7.1999
(mostly from IPK Gatersleben, Germany)
 - ▶ Air and soil temperature
 - ▶ Temperature sum
 - ▶ Global radiation
 - ▶ Wind speed
 - ▶ Relative humidity
 - ▶ Dawn, dusk, day length
 - ▶ Cloudiness

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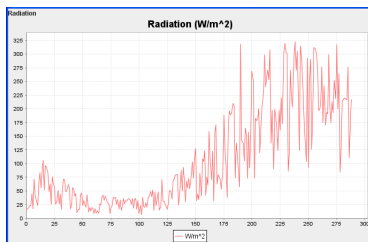
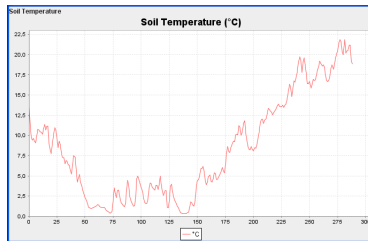
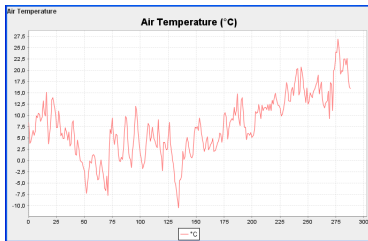
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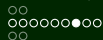
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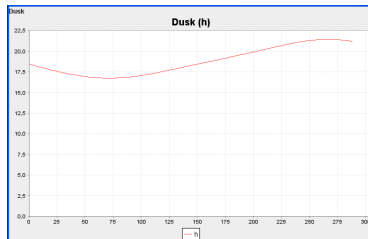
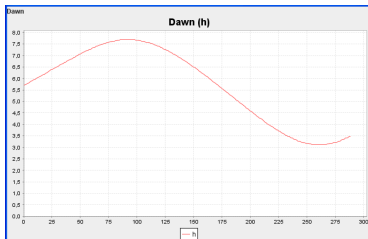
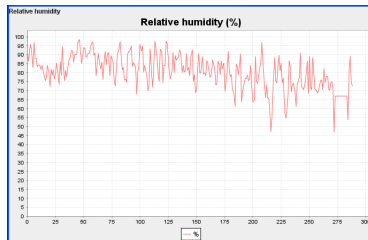
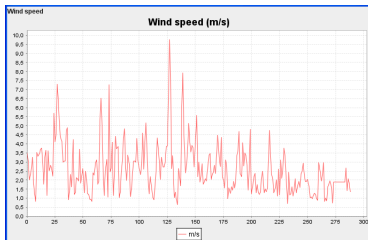
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Climate data (1)





Climate data (2)



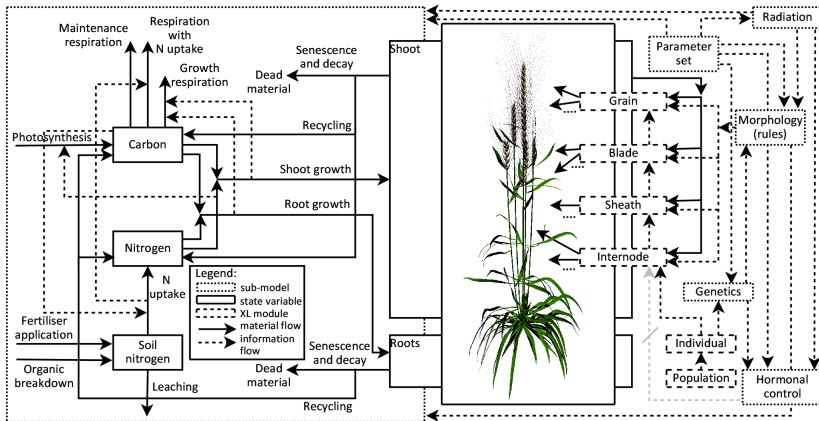
Partitioning within the shoot

- ▶ Partitioning of assimilates into organs of shoot controlled by sink strength concept
- ▶ Described by beta sigmoid function

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Schematic model diagram



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Solving ODEs in the model

- ▶ Growth (time course of growth process) described by growth functions
- ▶ Growth simulated with differential equations
- ▶ In the model, ODEs solved using a *rate assignment operator* of XL

- ▶ Example:
exponential
growth function

$$W = W_0 e^{kt}$$

$$\frac{dW}{dt} = kW$$

W - dry mass
k - growth rate
t - time

```
const double k = 0.3; double W;

protected void init()
{ W = 1; }

public void getRate()
{ W :'= k * W; }

public void run()
{ integrate(1); }
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Model run (simplified)

- ▶ Set initial structure
 - ▶ Population, Individual, Meristem (associated with several hormones)
- ▶ At each derivation step:
 - ▶ Compute ODEs (inside the function `getRate()`)
 - ▶ Compute the rate of change of each variable
 - ▶ Compute the rate of change of each hormone
 - ▶ Compute the rate of change of each cell
 - ▶ Compute the rate of change of each meristem
 - ▶ Grow the structure (produced by Meristem)

Model run (simplified)

- ▶ Set initial structure
 - ▶ Population, Individual, Meristem (associated with several hormones)
- ▶ At each derivation step:
 - ▶ Compute ODEs (inside the function `getRate()`)
 - ▶ Source:
 - Run radiation model (can be run before computation of ODEs)
 - Compute light interception per organ (can be run before)
 - Compute photosynthesis per organ
 - ▶ Sink:
 - Compute partitioning between shoot and root
 - Compute potential, actual growth rate for each organ
 - Update size of organs
 - ▶ Grow the structure (produced by Meristem)

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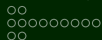
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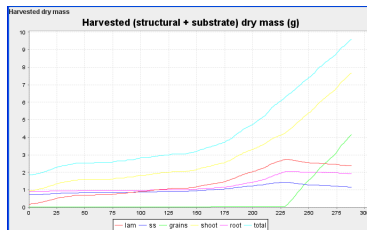
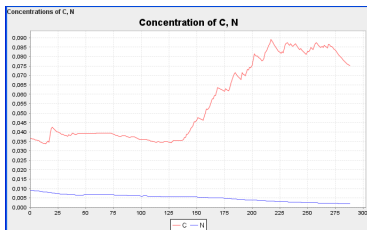
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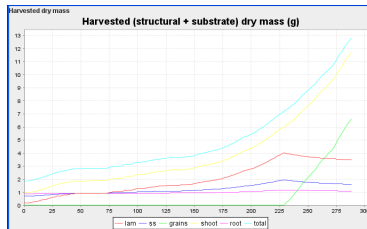
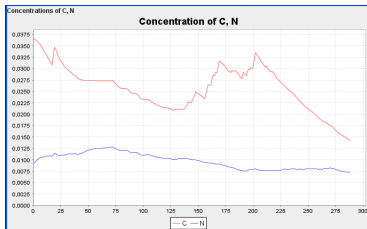
Summary



Simulation of growth at different N fertilisation scenarios

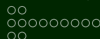


0kgN/ha
(t = 0)



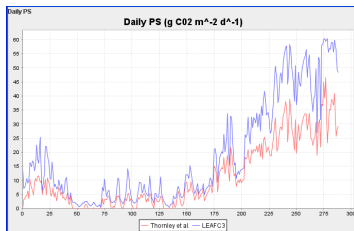
100kgN/ha
(t = 0)



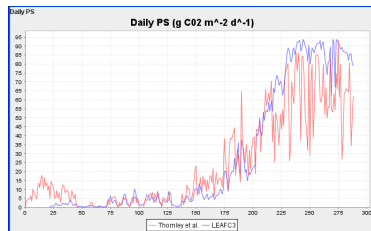


Photosynthesis with/without sensitivity to nitrogen

- ▶ Comparison of photosynthesis rate models
 - ▶ Non-rectangular hyperbola (Thornley et al. 1990 / Thornley et al. 1989)
 - ▶ Photosynthesis-stomatal conductance model LEAFC3 / LEAFC3-N (Nikolov et al. 1995 / Müller et al. 2008)



not sensitive to N



sensitive to N

leaf area 1 m²

100 kgN/ha
(*t* = 0)



Conclusions and future work

- ▶ **Implementation of concepts to model effects of C and N**
 - ▶ Within-shoot C and N partitioning (e.g., N remobilization) needs to be improved
- ▶ **Model evaluation and further parameterisation needed**
- ▶ **Coupling of partitioning and hormonal regulatory network sub-models**
 - ▶ Internode elongation
 - ▶ Tiller formation

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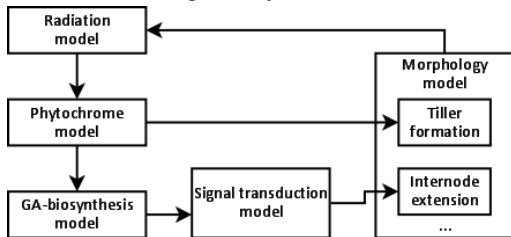
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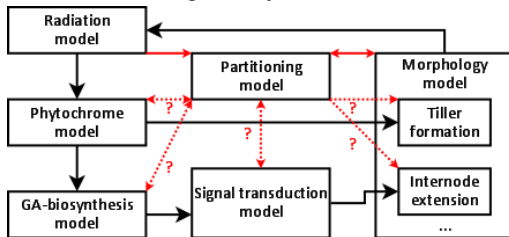
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