# AGROS knowledge event "The road towards sustainable data-driven agriculture"

April 24, 2024, Wageningen University & Research, Wageningen, The Netherlands









### Program network and knowledge event

13:00 Keynote Marc Jacobs – Digitalisation in agriculture, integrating human and technological processes

- 13:45 AGROS Examples of horticulture, arable farming and dairy
- 14:30 Workshop session 1
- 15:10 Coffee and tea break
- 15:40 Workshop session 2
- 16:20 Workshop session 3
- 17:00 Closure with drinks









# AGROS "To sustainable agricultural systems"

Integration of biology and technology in arable farming, dairy and horticulture Anja Dieleman, István Fodor and Jan Kamp, Wageningen, April 24, 2024









# Challenges in agriculture

- Economic viability
- Resource use efficiency:
  - Energy (consumption and production)
  - Water and nutrients
- Availability of skilled labour
- Animal and crop health
- Greenhouse gas emissions
- Biodiversity





#### Fast developments in automation, AI, etc.









# Next step: data-driven agricultural production systems, based on sensors, vision technology, and intelligent algorithms to support decisions







#### AGROS

- "Technology for ecology" concept
- Three use-cases: horticulture, arable farming and dairy

Challenges:

- Greenhouse horticulture: resource use efficiency, labour and economic viability
- Dairy farming: GHG emissions, resource use efficiency, and animal health
- Arable farming: crop health, energy production and biodiversity





### AGROS "Towards an autonomous greenhouse"

- Terminology "autonomous cultivation"
- In AGROS: Development of intelligent algorithms for autonomous control of greenhouse climate and crop management
- Based on sensor data
- Using an objective goal function.





# Steps towards an autonomous greenhouse"

#### **Understand** crop physiology and cropping system Under changing conditions

# **Sensors** for automated crop measurements

- Digital
- Robust
- Interpretable



#### Models for

- Analysis
- Interpretation
- Prediction

#### **AI algorithms**

- Selection
- Prediction
- Control





### Steps "to an autonomous greenhouse" - AGROS





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### Data required for control

#### Greenhouse climate

Set points Realized climate

#### Crop management

Leaf picking - LAI Fruit pruning strategy Average fruit weight No of harvests/week

#### Crop

Light interception Leaf formation rate Fruit growth duration Harvest (no and weight)

#### Irrigation

No of irrigation shots Shot size % drain



#### WS Session 1 Smart sensing

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### Data required for control

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WS Session 1 Smart sensing



### Vision technology: plant development rate

- No of newly formed leaves crucial for control
- No sensor available
- Trained object detection network to monitor and count leaves
- Provides daily value

WS Session 3 Vision technology





### Intelligent algorithms

- Development of intelligent algorithms for autonomous control of greenhouse climate and crop management
  - Based on mechanistic greenhouse climate model and crop models: Digital Twin
  - Based on AI: Reinforcement Learning



# Proof of concept "autonomous cultivation"

- Three cucumber crops were controlled by:
  - Reference "growers"
  - Digital Twin
  - AI Reinforcement learning
- Cultivation January March 2023
- Goal function: maximize net profit (costs: heat, electricity and CO<sub>2</sub>, benefit: cucumbers)
- Data collection by cameras and sensors, validation by manual measurements





WS Session 2 Intelligent control



### Results "proof of concept" autonomous cultivation

Successful autonomous cultivation strategies:

- Full autonomous control of cultivation by Digital Twin
- Autonomous control of climate during 2 months by Reinforcement Learning
- Reference: cultivation according to cultivation plan, little adjustments required
- Vision technology: good results in measurements of crop characteristics
- Datasets of greenhouse climate, crop and sensor data generated.





### Future perspectives

- Autonomous greenhouse control is feasible
- Can deal well with uncertainties weather forecasts, variable prices of inputs and products, ...
- Challenges: reliability of data (input in control), cyber security, availability of internet, adoption by growers, ...
- Future steps: determine crop boundaries, vision development, AI algorithms, growers' involvement, application of concept.

AGROS II.





# AGROS "Towards a sustainable dairy farming"

Develop methods for *individual* monitoring

- $\rightarrow$  Improve sustainability of dairy production
- $\rightarrow$  Improve animal health











Improved **feed efficiency** (~ kg feed/ kg milk)

↓ environmental impact
↓↓ costs (feed >50% of total costs)

#### **Emissions from cows**

- $\rightarrow$  Global warming
- → Loss of energy from feed

How are these linked? Relationship with health?

#### WS Session 2 Detection and intelligent control of diseases







\* Dairy until December 2024



#### Breath analysis as a **non-invasive early** disease detection tool in cows

Use breath to "look into blood composition"

Volatile Organic Compounds (VOCs)

Pilot – results available

WS Session 2 Detection and intelligent control of diseases





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#### 2D & 3D computer vision applications on farms

Disease detection (e.g., lameness)

Behaviour

Feed intake

....

#### WS Session 3 Vision technology: monitoring cows and cucumbers





RGB-depth imaging to estimate feed weight



### Future perspectives

- Emission monitoring
  - Scaling up
  - More information than GHG ~ global warming
- Computer vision wide range of applications
- Individual cow-level information
  - $\rightarrow$  Monitoring (e.g., disease)
  - $\rightarrow$  Breeding (e.g., emissions, resource use)





#### AGROS: "Towards sustainable arable farming"







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# AGROS: "Towards sustainable arable farming"

T4E concept as a central focal point



#### • Fast developments in farming:

- + highly productive
- + reduction of labor / ha

- soil compaction
- loss of biodiversity

#### Ecology to the background





### Translation T4E in AGROS – Arable Farming

- What is needed in the near future? Main challenges related to T4E?
- Our reference: Farm of the Future concept
- How can technology support ecology in new farming systems?





#### Future scenarios – Ellen Bulten / Herman Schoorlemmer

#### 3 scenarios for future mixed cropping systems in 2040

- Data for your convenience
- Ecology at the wheel
- Crisis for action

Each scenario describes:

- Socio-societal and climatic context
- Arable value chain
- Arable farm



Interested?? Go to: Session 3 - #1 (Herman Schoorlemmer) Meidoornzaal





Data for your convenience

# Control of pest and diseases in crops Corne Kempenaar / Jos Tielen

- Biologicals on Farm of the Future
  - Serenade experiment (*Bacillus amyloliquefaciens*) in potato
- Sustainability evaluation
  - Environmental Impact Reduction CP and Milieu Indicator Gewasbescherming interactions  $\rightarrow$  CPI's  $\rightarrow$  Session 3 - #3
- Digital farming on Farm of the Future.
  - FieldView Akkerweb connection (FV movie) https://www.youtube.com/watch?v=vDlp1PbdjtY)
  - HortiView voor EU

**Interested??** Go to:

Session 3 - #3 and/or Session 1 - #1









# Weed control & Disease detection Seed potatoes

Disease control: Jan Kamp

 Develop a robust prototype for smart disease detection (viruses, Erwinia) that is able to detect these diseases

Weed control: Bram Veldhuisen

- integrated weed control system
  - volunteer potato control
  - combining mechanical weed control and onions/weed detection



**Interested??** Go to: Session 1 - #3 Meidoornzaal





# Innovative sensor technology for arable farming – One Planet

- One planet / IMEC sensor
  - Optical sensor technology for nitrate detection (handheld, NO3 in solution)
- Decision to stop this development





# Future infrastructure – Energy & Data

Energy: how to become self sufficient? Jan Kamp

- Analysis of several scenario's: 100ha farm + storage on farm
  - Current energy use (based fossil fuels)
  - Energy use in future mixed cropping system Fossil free
    - Battery powered
    - Hydrogen powered

**Interested??** Go to: Session 2 - #1 Energy & Grid solutions → Meidoornzaal

#### Data:

Corne Kempenaar / Johan Booij

What is needed due to developments in and around the farm?

- in-depth analysis of current data infrastructure Interested??
- Go to: Session 1 #3 Farmers ■ connection with EU data act / Data infrastructi Data Space → Lijsterbeszaal





#### Public private partnership - partners



### Questions







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