

# AI in Agriculture for tackling Social and Environmental Challenges

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# The agriculture and food value chain

**agricultural machinery, agrochemicals, plant breeding industries**

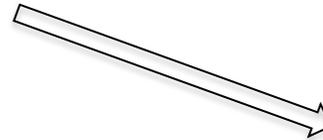


Created by Pedro from Noun Project

**Agriculture:**  
crops, livestock



Created by Symbolon from Noun Project



Created by Vectors Point from Noun Project

**bio-based products and bioenergy industries**



**food processing industries**

Created by Edwin PM from Noun Project



Created by Made from Noun Project

**Wholesale and distribution:**  
whousers, retailers, restaurants



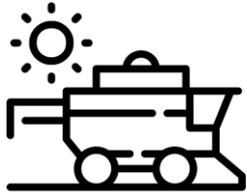
Created by Nithinan Tatah from Noun Project

The **consumer**  
Demand and consumption

# Social and Environmental challenges for Agriculture

- Feeding the world: 800 millions undernourished people, 2 billion more people by 2050
- A richer population with an increased demand for animal products
- Farmers' demand of decent incomes and working conditions
- Scarcity of natural resources (e.g. Phosphorus for fertilizers, oil for energy)

# Energy footprint of Food (in France)



Created by Pedro  
from Noun Project

**Agriculture**  
26,6%



Created by Symbolon  
from Noun Project

**Food**  
31,6 Mtoe / year  
13% global consumption

**Food transformation**  
15,5%



Created by Edwin PM  
from Noun Project

**Food retail**  
13,3%



Created by Made  
from Noun Project

**Transport**  
30,7%



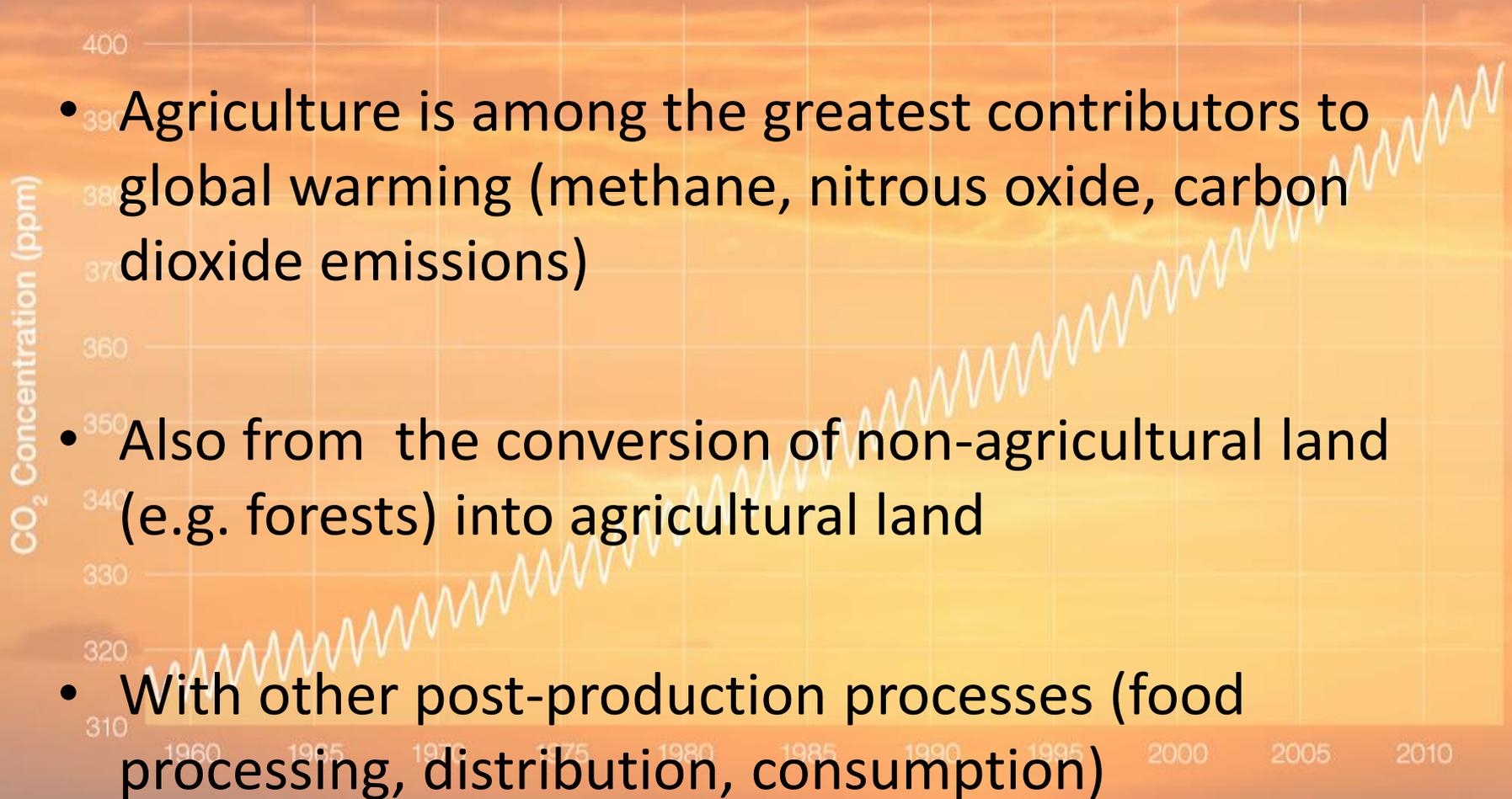
Created by Nithinan Tatabh  
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**Home consumption**  
13,9%

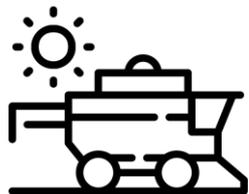
# Social and Environmental challenges for Agriculture

- Feeding the world: 800 millions undernourished people, 2 billion more people by 2050
- A richer population with an increased demand for animal products
- Farmers' demand of decent incomes and working conditions
- Scarcity of natural resources (e.g. Phosphorus for fertilizers, oil for energy)
- Agricultural pollution: contamination or degradation of the environment (pesticides, herbicides, fertilizers, animal wastes...)

# Agriculture contributes to Climate Change



# GHG footprint of Food



Created by Pedro  
from Noun Project

**Agriculture**  
75% (65%)



Created by Symbolon  
from Noun Project



Created by Edwin PM  
from Noun Project

**Food transformation  
+ retail + transport**  
15% (20%)



Created by Made  
from Noun Project



Created by Nithinan Tatab  
from Noun Project

**Home consumption**  
10% (15%)

**Food**  
13,8 GteqCO<sub>2</sub> / year  
28% global emission  
*(163 MteqCO<sub>2</sub>, 24% in France)*

# Impact of Climate Change on Agriculture

## **Decrease of productivity** due to

- changes in temperatures and rainfall
- increased impacts of natural hazards (floods, droughts, storms)
- reduced water resources
- increased diseases and parasites

## **Changes in the social demand**

- Preservation of the environment
- Consumers' demand for local, organic or low-input food products



# Climate smart agriculture

Smarter farming for **productivity raise, mitigation and adaptation** to climate change

## New agronomical practices

- More resilient crop varieties and species
- Improved irrigation practices
- Increasing agroforestry
- Developing biocontrol and agroecology

## Developing technologies

- Biotechnology
- **Digital agriculture**

# A digital agricultural revolution

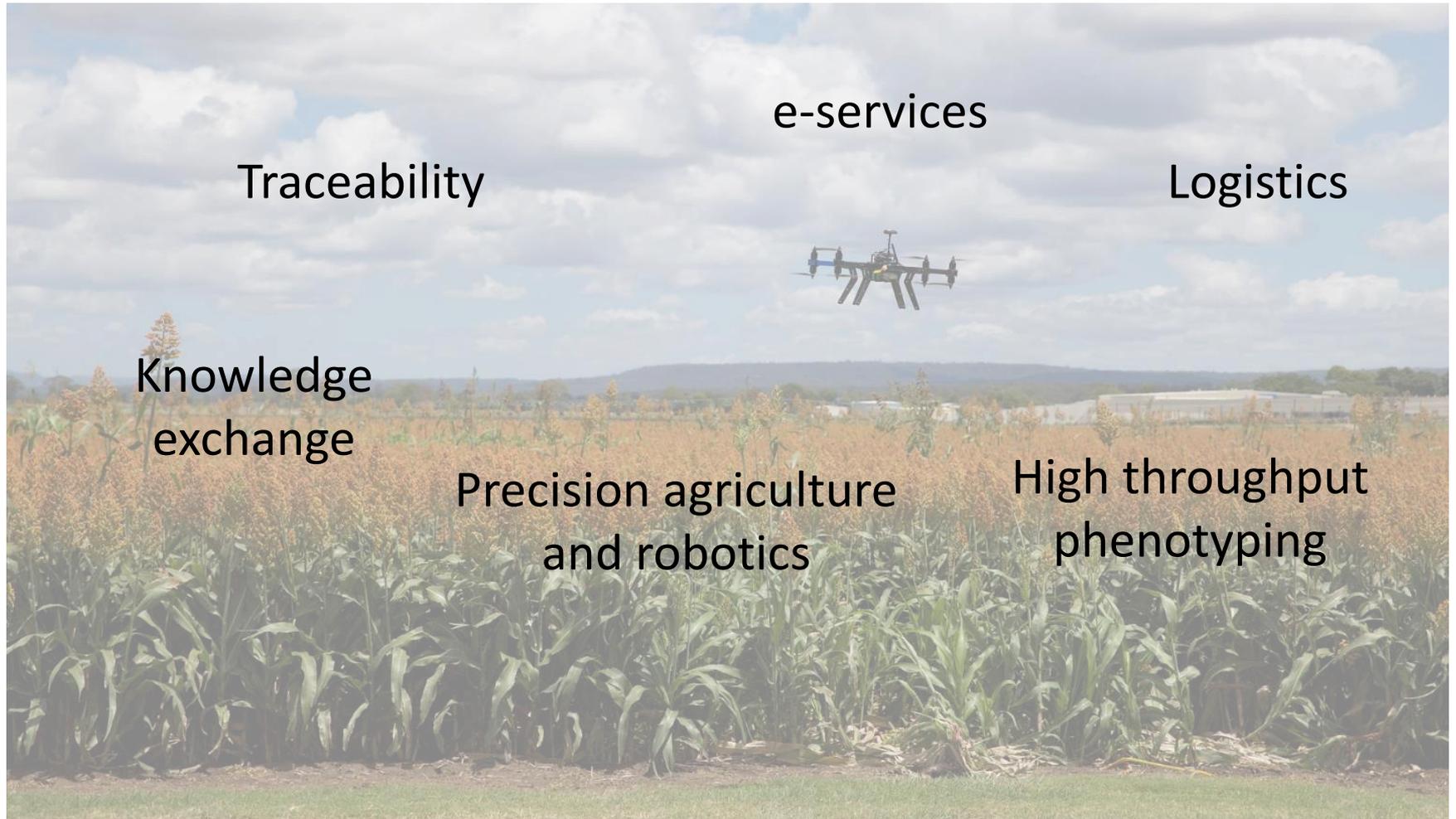
Digital agriculture: agriculture based on digital technologies that collect, store, analyze, and share electronic data along the agricultural / food value chain.

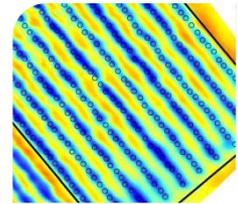
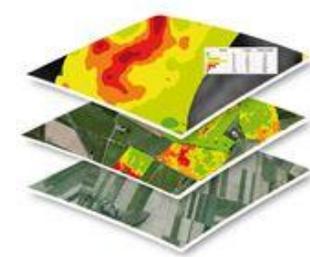


-> New tools for farmers to optimize management of resources, improve crop quality and quantity, and remain productive in a changing climate.

-> Digital integration of potentially all food process stages, from refining crop genetics to managing transportation logistics and B2C relationships

# A digital agricultural revolution

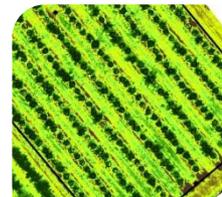




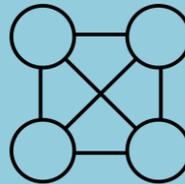
# The Digital Agriculture Convergence Laboratory, Montpellier, France



**#DigitAg**



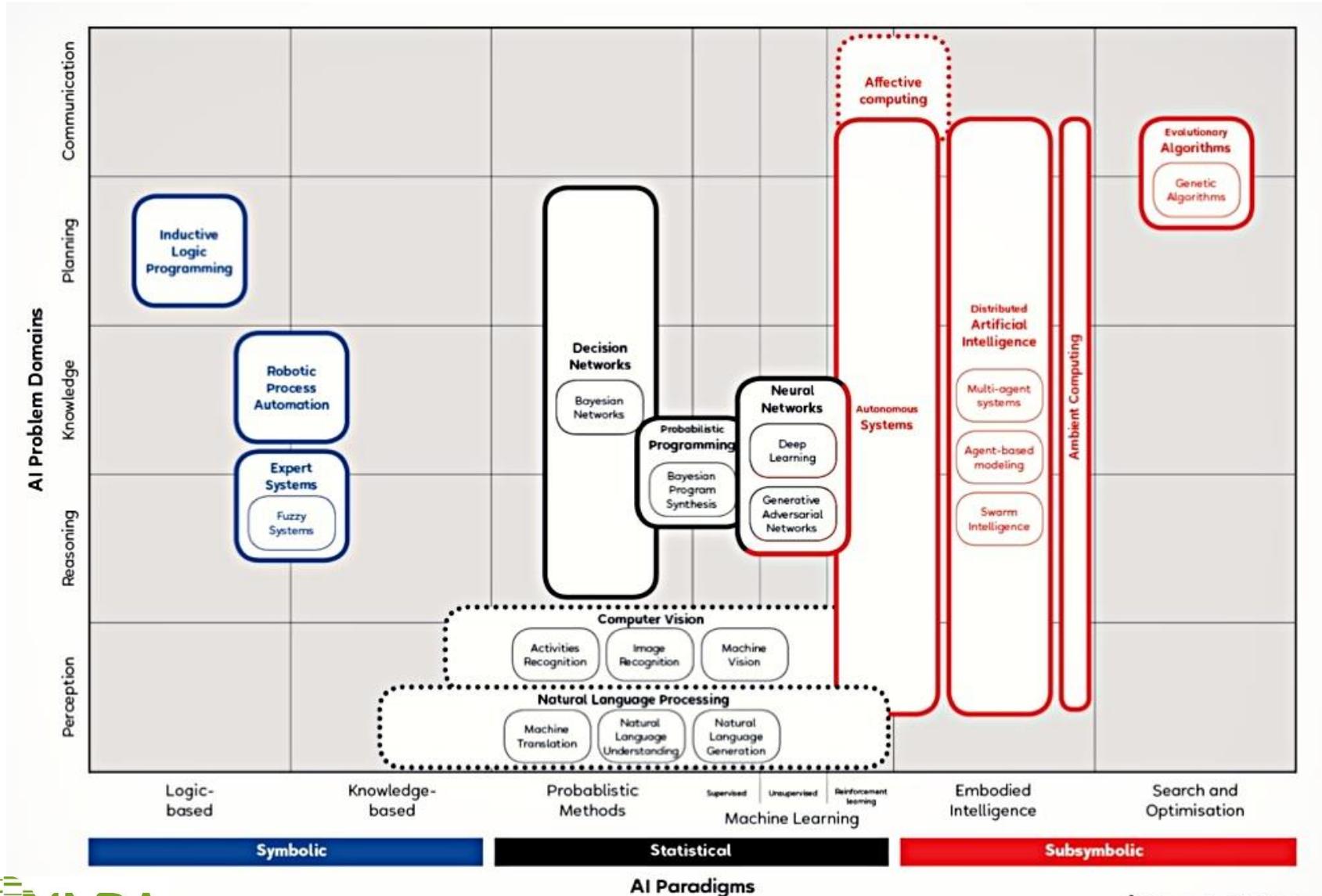
# Artificial Intelligence: observing, reasoning, acting



decisions



# The AI knowledge map



# Artificial Intelligence: a core technology for digital agriculture

(Low-cost) RFID monitoring

IoT – internet of things

Satellite

UAV

Sensors

Digital agriculture

Tractors and farm machineries

Robots

Observation

Action

Diagnosis

Recommendation

AI decision and planning



# Artificial Intelligence: a core technology for Digital Agriculture

Knowledge representation and management

Web platforms

Data warehouses

Ontologies

Semantic Web

Knowledge modeling

Digital agriculture

Observation

Action

Diagnosis

Recommendation

AI decision and planning



# Artificial Intelligence: a core technology for Digital Agriculture

Machine Learning

Simulation models

Knowledge representation and management

Statistical learning

Predictive modelling

Data warehouses

Ontologies

Image detection, recognition and classification

Semantic Web

Digital agriculture

Knowledge modeling

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Diagnosis

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AI decision and planning

AI optimisation and design

CSP

Formal models

Multi-criteria decision

Evolutionary algorithms

# Artificial Intelligence: a core technology for Digital Agriculture

Machine Learning

Statistical learning

Predictive modelling

Image detection, recognition and classification

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Knowledge modeling

Digital agriculture

Observation

Action



Diagnosis

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AI decision and planning

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Multi-criteria decision

Evolutionary algorithms

# Optimizing irrigation

- planning under uncertainty,
  - reinforcement learning,
  - simulation-based optimisation,
  - image classification,
  - model-based diagnosis,
- are AI technics already used for optimal management of irrigation

Next step is about collective water management with distributed sensors, IoT and multi-agent decision making

## AI *in* IRRIGATION

### HOW AND WHY IS AI MAKING WAVES IN AG IRRIGATION?

Discover how AI technology has impacted these 4 areas in agriculture irrigation.

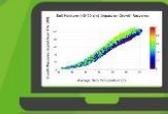
#### #1 SCHEDULING & EFFICIENCY

AI can be applied to learn the associations between available weather, crop and soil condition data, and the corresponding irrigation recommendations of a trained agronomist, thereby automating the repetitive aspects of the scheduling process.



#### #2 ENVIRONMENTAL INFLUENCE

AI can be applied to growth stage, weather, and soil data in order to foster the development of more accurate crop growth models, potentially resulting in improved irrigation scheduling.



#### #3 PREDICTING CANOPY WETNESS

AI can be particularly useful for problems where the underlying physical processes are poorly understood, or difficult to simulate with more traditional models. For example, canopy wetness can be very difficult to diagnose and predict based on scientific principles alone. However, an AI-based model can learn the associations between observed canopy wetness and the factors that influence it. These associations can later be applied to diagnose and predict canopy wetness at other times and locations, without the need for additional sensors.



#### #4 TAKING TO THE SKY

AI could also be used to automate the analysis of aerial imagery of a field. This might include diagnosing areas of crop stress due to moisture, disease, etc. AI can further identify the relationships between observed crop stress and sensor- or model-based soil moisture data, helping to fine-tune the trigger points for initiating irrigation.



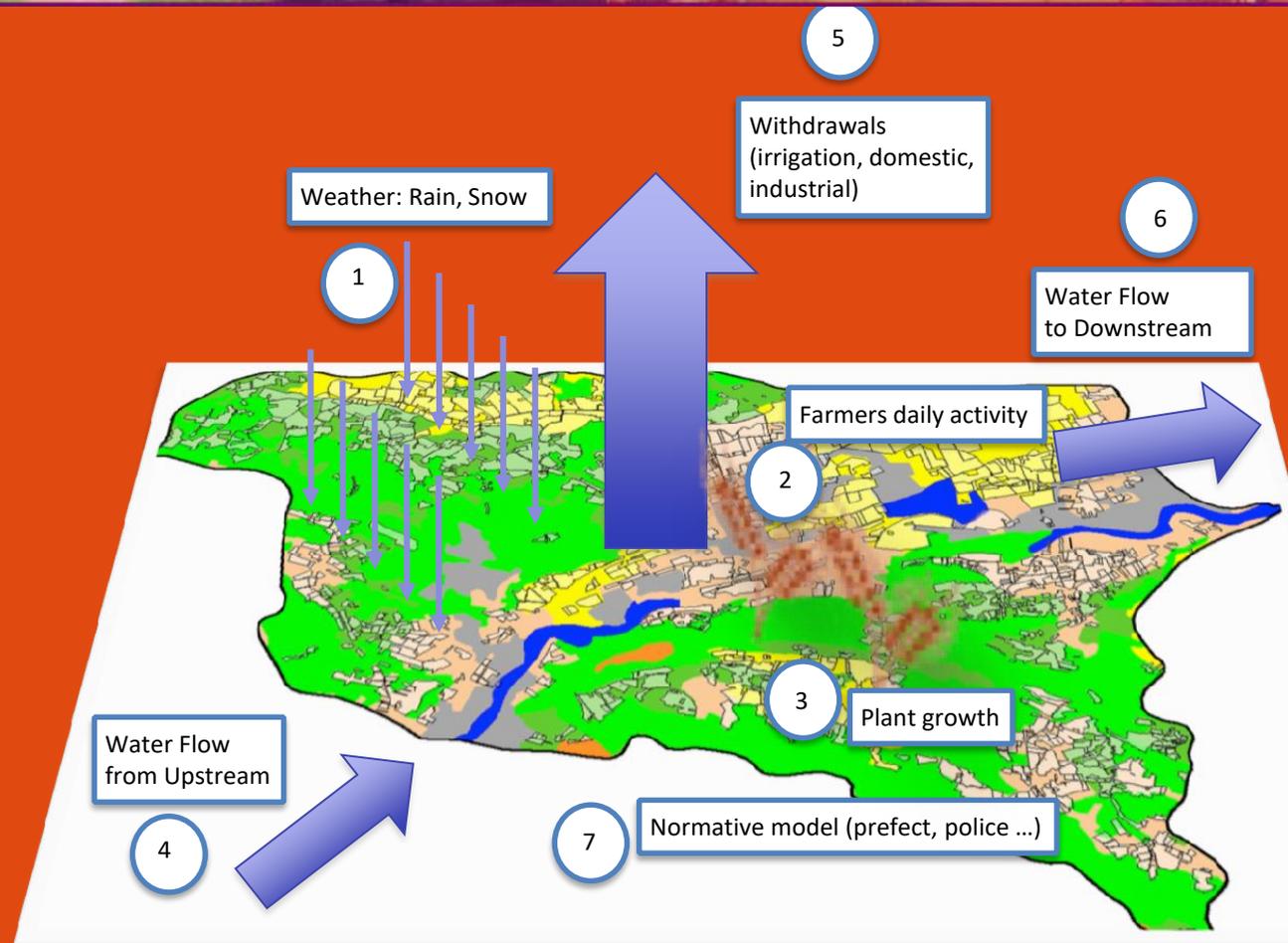
#### WHAT'S NEXT?

The time to start collecting data is now in order to realize the many benefits this advanced technology promises.

# Simulating Territories

Simulating socio-environmental impacts of norms related to the governance and management of water

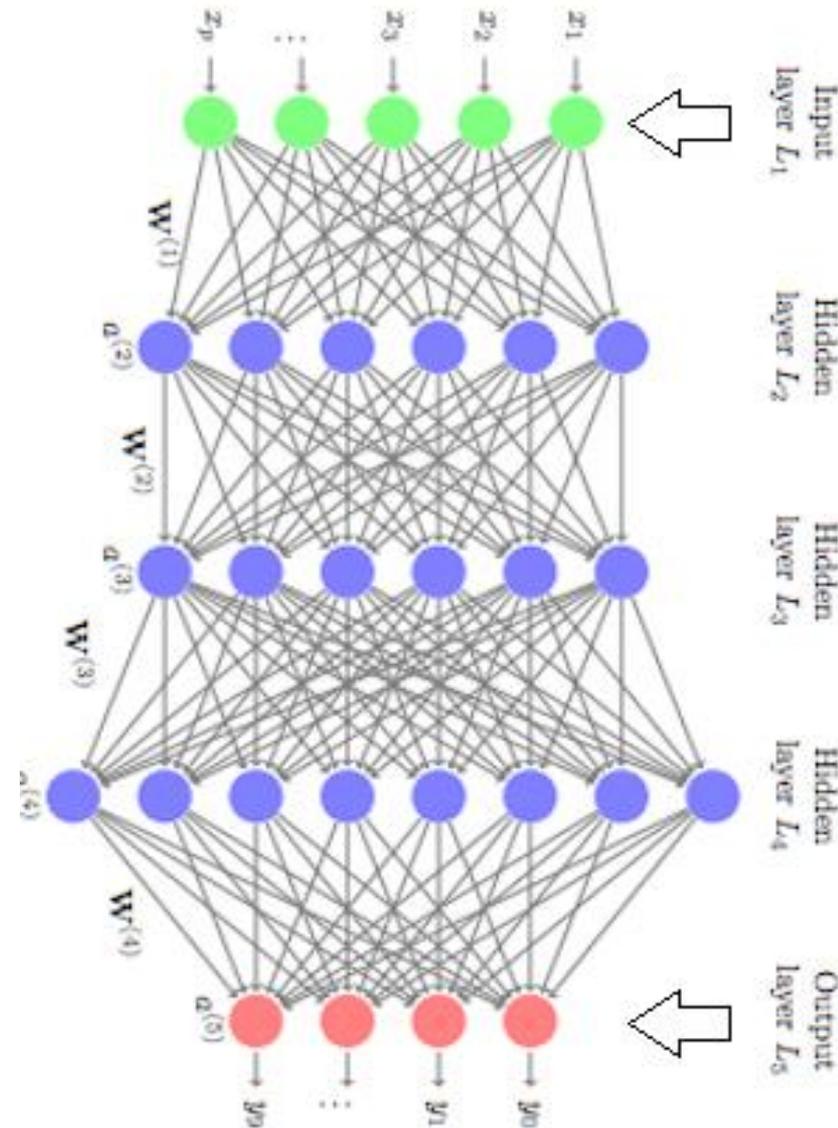
- Multi-agent modeling (the GAMA platform)
- Human-behavior modeling (rules, BDI)



# Deep learning in Agriculture

Classification and prediction from big data sets (images, audio, ...)

- Animal identification
- Animal behavior prediction
- Detection / Recognition of plants
- Detection / Recognition of diseases
- Identification / classification of phenological stages
- Land use classification
- Crop yield prediction
- Fruit counting
- Soil moisture prediction



Source: A. Kamilaris et al., *Computers and Electronics in Agriculture*, 147 (2018)

# Text-mining in Agriculture

## Information Retrieval / Extraction

- Named entity detection
- Food price prediction
- Monitoring
- Farm management
- Knowledge extraction

## Sentiment Analysis

- Commodity and food price prediction
- Pest control
- Opinion monitoring

# Numerous investments in artificial intelligence for agriculture

Microsoft, IBM, Google, Intel, Bosch, Bayer, Airbus, and many other companies and startups

 40+ startups transforming agriculture with AI & robotics

## Spraying & Seeding



## Geospatial Insights



## Weeding & Rock Picking



## Plant Genomics



## Supply Chain



## Phenotyping



## Inspection



## Harvesting



## Irrigation



# Limits and risks

Digitalisation can be used to transform the current agri-food system in order to face today's climate and environmental challenges,

but:

- Precision agriculture is sophisticated and not cheap. Can we make AI-based digital agriculture accessible and available at large scale?
- Digital agriculture tends to impose standardisation to increase productivity but also cut employment, increase farm size and also technological dependence: is it the only way ?
- The issue of data ownership is crucial
- AI is energy-intensive, and we also need digital sobriety ...