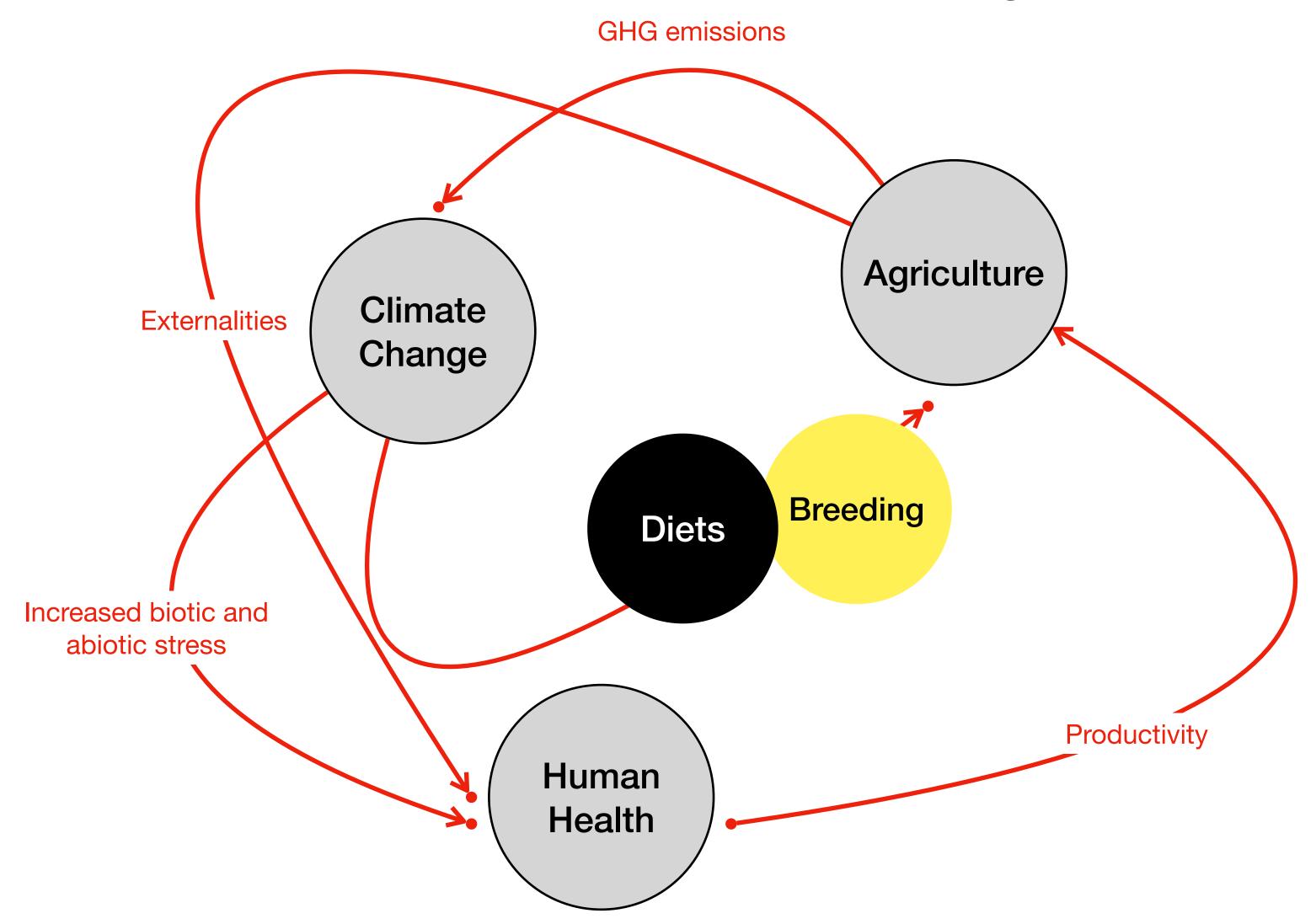


Syndemic

Multiple interconnected disruptions at global scale



+2.1 Trillion



1,145





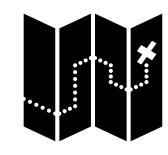




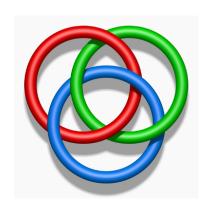
Primitives



Breeding enable us to reimagining agriculture as a solution to climate change and human health crisis



New breeding technologies and breeding efforts will be required to enable the transition of agricultural systems



Need a framework for plant breeding for climate change (and Urban Agriculture) to improve **availability**, **access** and **adoption** of nutrient rich foods



"How to harmonize <u>crop improvement and AI</u> efforts for agricultural systems to regenerate the environment while providing nutrition security, improve human health and adapt to climate change?"

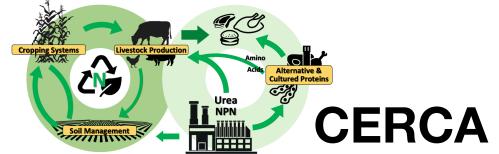
















Food as Medicine

Crop improvement opportunity (I)



2X increase consumption to Fruits and vegetables

Expand areas of production

New phenomics

Lack of investment / focused on row crops

Circularize nutrient flows (GHG) Crop improvement opportunity (II)

Cropping Systems

Livestock Production

Amino
Acids

Alternative & Cultured Proteins

Urea
NPN

Soil Management

USDA- ARS Ed Buckler et al

Rethink maize ecophysiology

Breed new traits

Lower N&P in grain

Cold tolerance

Remobilize N to roots

Increase N supply from soil

Sync N supply & demand

Climate change adaptation

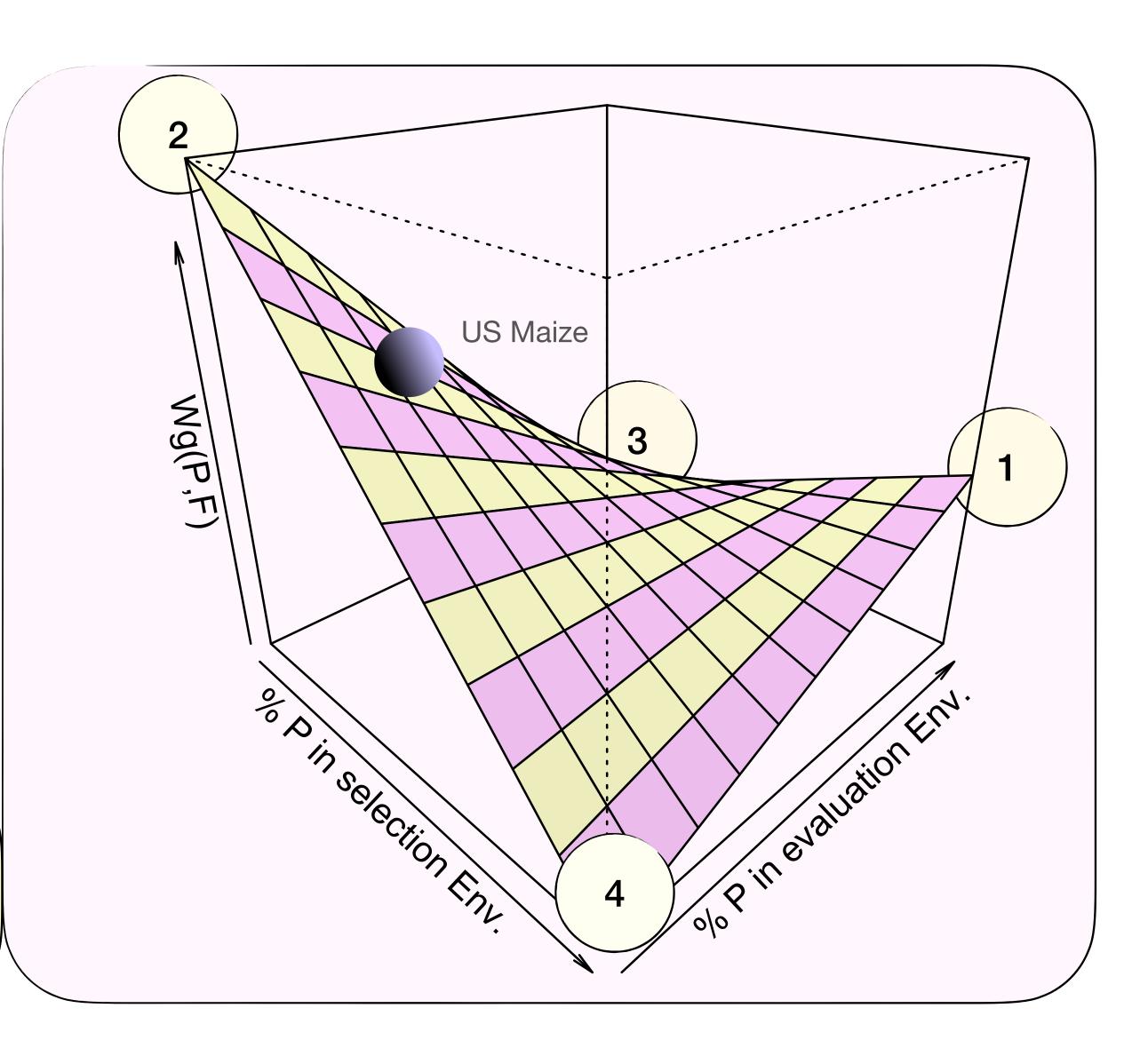
Crop improvement opportunity (III)

Can our breeding systems create the products needed in the future?

No empirical evidence published

Aiming to unknown targets Unprepared to adapt to climate change

- 1. Select in P like environments for P like environments | Current breeding
- 2. Select in F like environments for F like environments | Climate change breeding
- 3. Select in P like environments for F like environments | No adaptation to the F
- 4. Select in F like environments for P like environments | No adaptation to P



Climate change adaptation

Glimpse from a 100 year long experiment

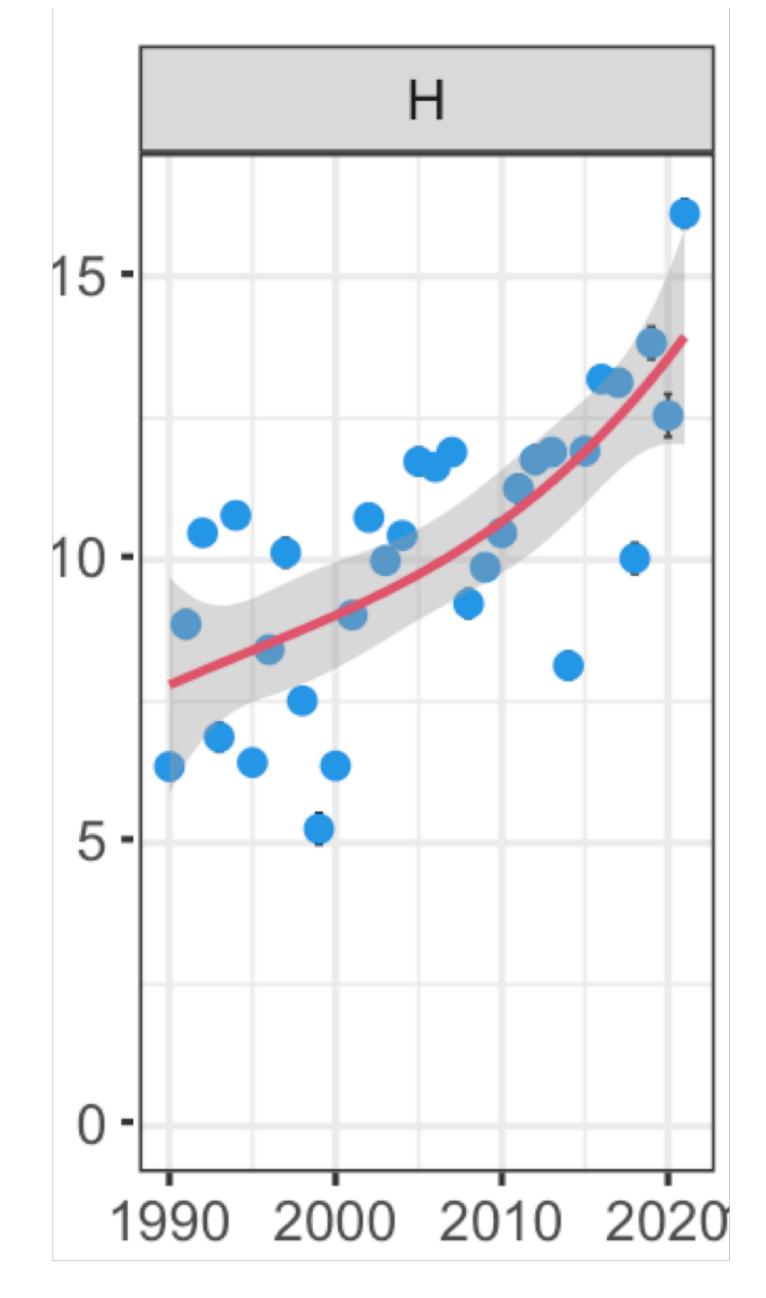
Messina, Borras, Tang, Cooper (2023) https://www.biorxiv.org/content/ 10.1101/2023.09.19.558447v1

Where do we stand with other crops?



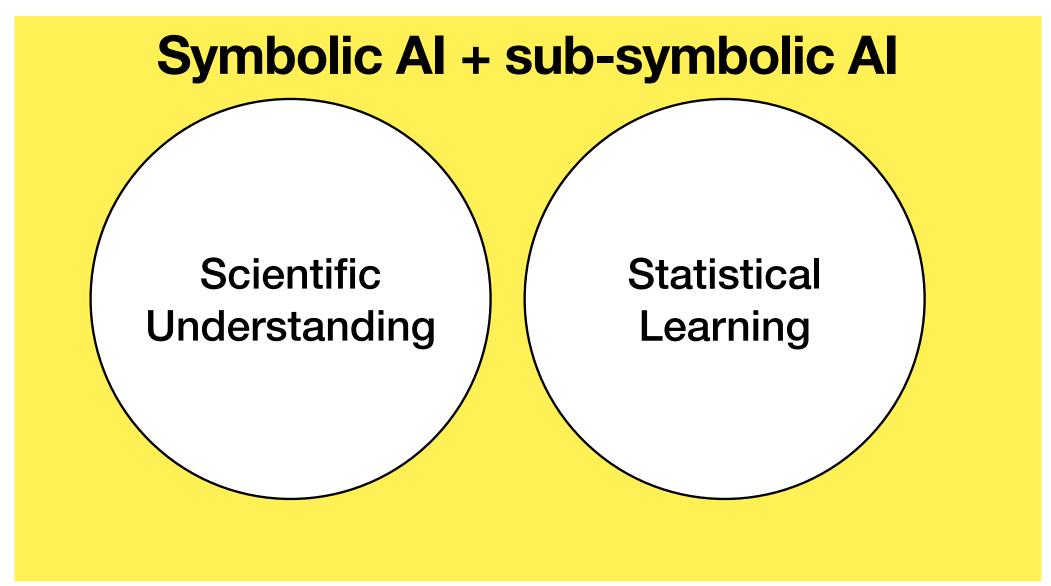


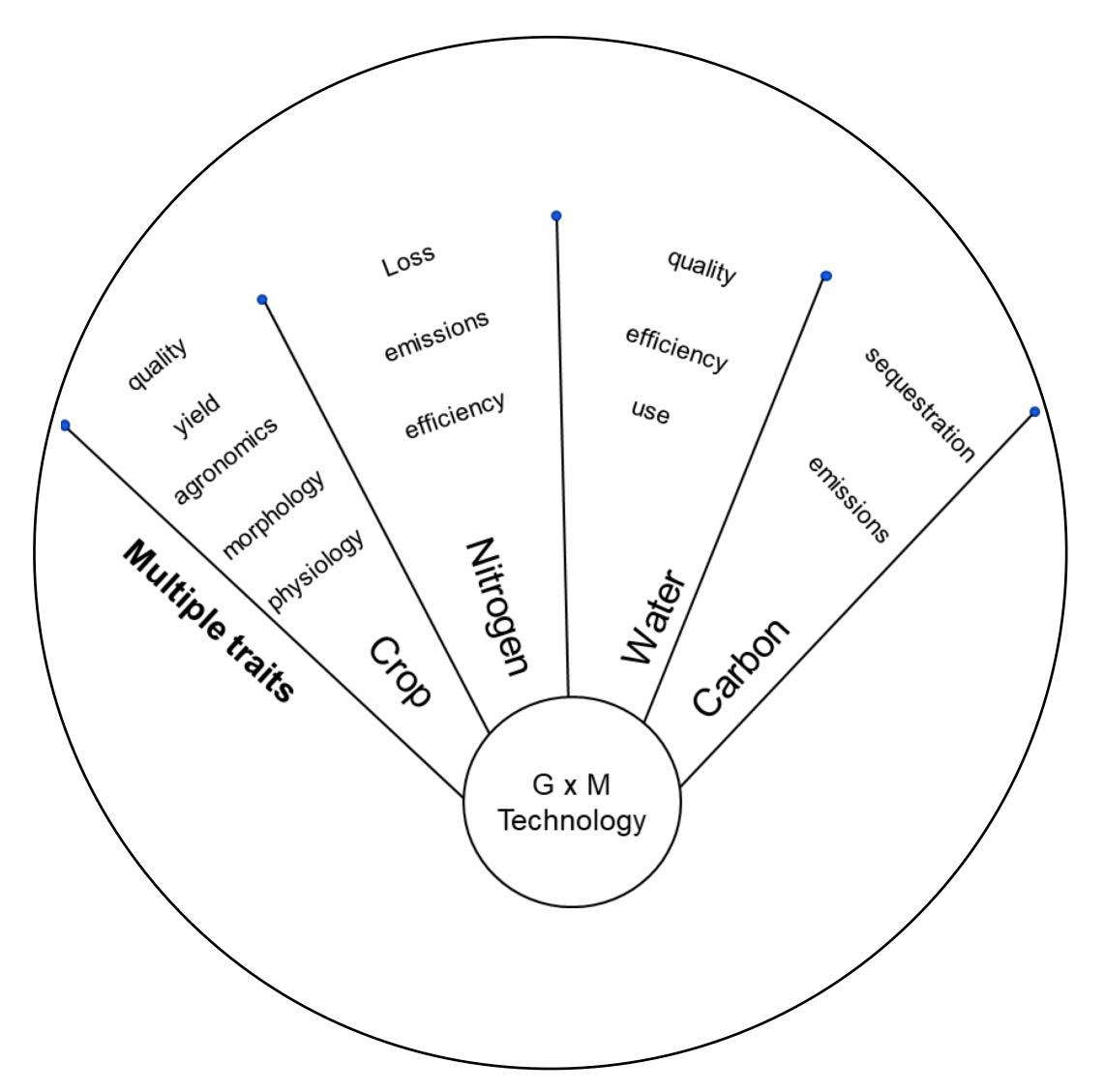




Year of experimentation

Multidimensional Framework







New frameworks for prediction

OMICS integration Abductive reasoning Simulation of cropping systems

Phenomics (IoT)

Measure the state of the system at relevant points in time to allow estimation of parameters (physiological and genetic)

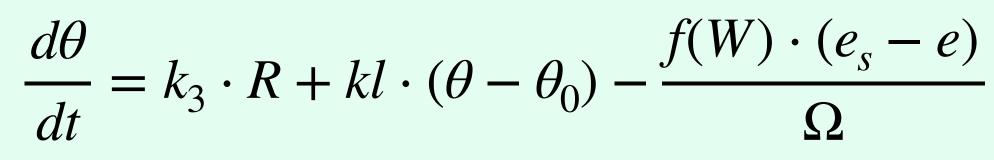
Artificial Intelligence

Deductive, Inductive and Abductive reasoning to solve the system of equations Messina et al. 2018

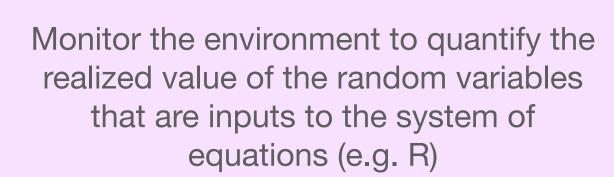
$$P(\Theta/D) \propto P(D/\Theta)$$

Crop growth model-genomic selection

$$\frac{dW}{dt} = P_m(1 - e^{-Q \cdot PAR \cdot (1 - e^{-k_1 \cdot W \cdot \kappa})}) \cdot f(\theta) - k_2 \cdot W$$



$$\begin{pmatrix} \hat{\mu} \\ \hat{\mathbf{g}} \end{pmatrix} = \begin{pmatrix} \mathbf{1}'_n \mathbf{1}_n & \mathbf{1}_n \mathbf{X} \\ \mathbf{X}' \mathbf{1}_n & \mathbf{X}' \mathbf{X} + \mathbf{I} \lambda \end{pmatrix}^{-1} \begin{pmatrix} \mathbf{1}'_n \hat{\Omega} \\ \mathbf{X}' \hat{\Omega} \end{pmatrix}$$

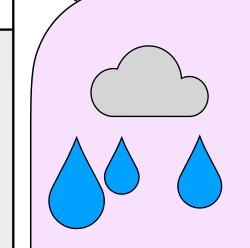


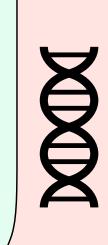
Environmics (IoT)

Methods to characterize the genotype of each individual in the training and prediction sets to allow estimation and

prediction of performance f(x)dx



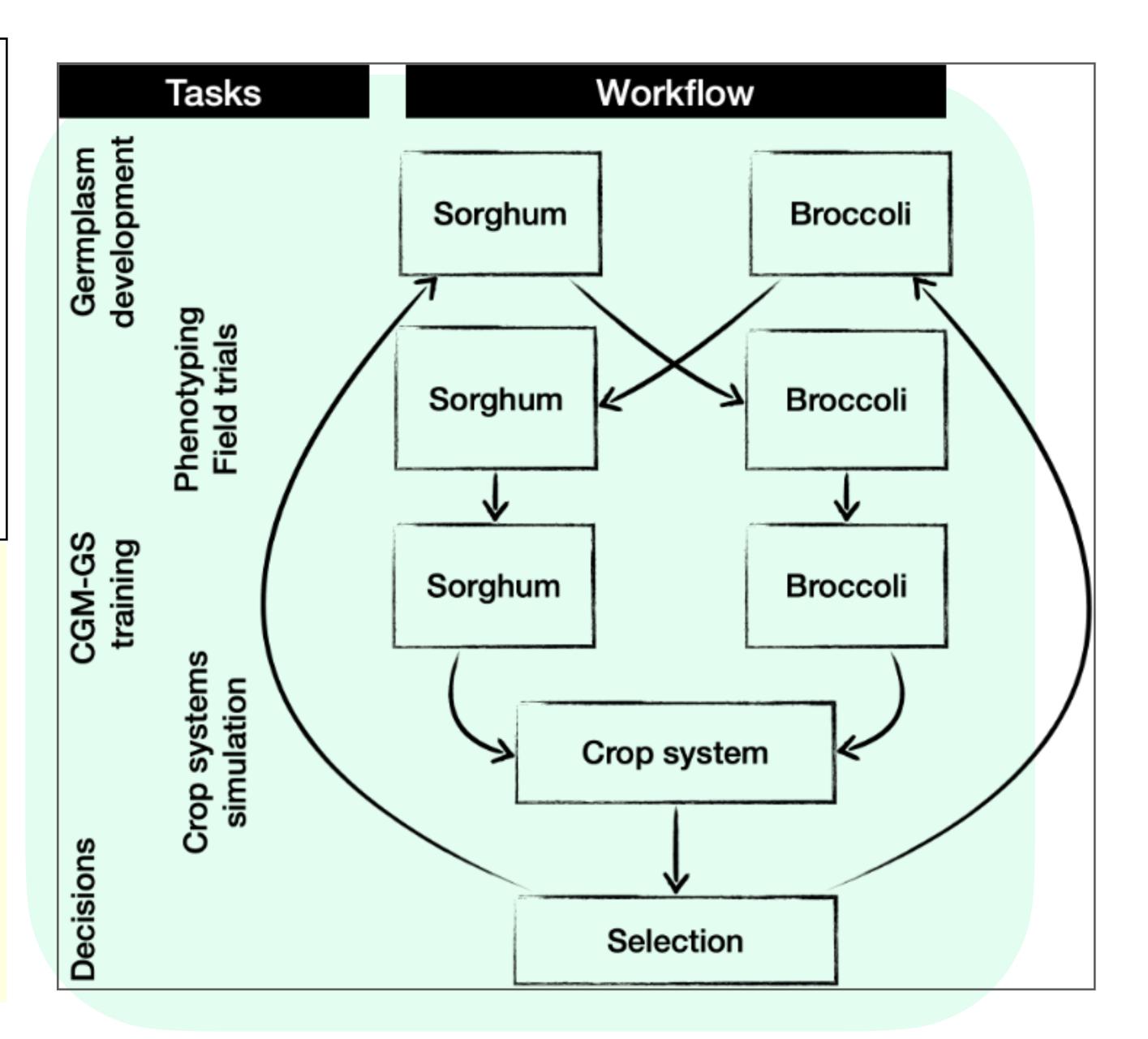




Challenge the paradigm

we can use crop growth models and genomic selection to improve prediction skill and enable agronomic optimization in **one** crop

then, we can use the same approach for multiple crops...and systems



Thanks



Agriculture as a solution

Improve human and environmental health

New frameworks needed

New investment for today and future crops