

How can precision agriculture techniques contribute to the breeding for low grain cadmium content in cereals?

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Aim: To identify genomic regions in **winter wheat** and **oat** associated with low grain-Cd content, **develop diagnostic markers and prediction models for selection of low-Cd lines** for implementation at Lantmännen

Partners:

Department of Plant Breeding, Soil and Environment,
SLU Fältforsk and Lantmännen

Collaboration:

Lucia Guterrez /Maria Inés Berro Rovella Uni.

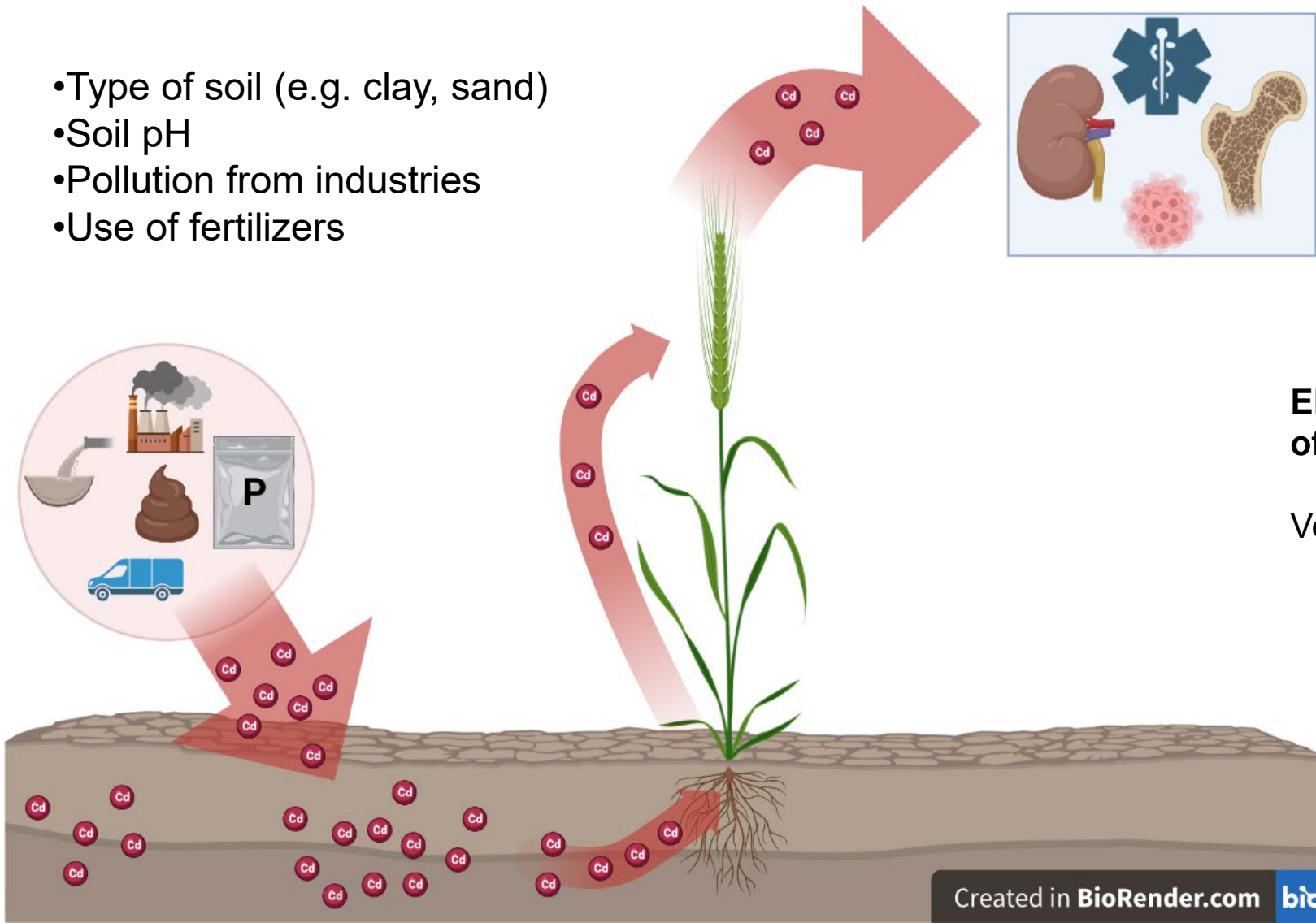
Wisconsin-Madison



Increased accuracy and reduced time and cost!

Cadmium's journey to your body

- Type of soil (e.g. clay, sand)
- Soil pH
- Pollution from industries
- Use of fertilizers



Kidney damage,
bone damage and cancer

**EFSA tolerable weekly intake → 2.5 µg
of Cd/kg body weight/week**

Vegetarians and children can exceed!

Cadmium in our crops

High levels!
Spinach, sunflower seeds,
flaxseeds, algae, seaweed, and
cocoa beans

Declining Cd levels



14%

Vegetables



22%

Root vegetables



40%

Cereals

In non-smokers → dietary exposure is the highest

Declining Cd level

Rice and durum wheat > bread wheat > oat, barley and rye

Project plan

Lantmännen's yield trials

3 years, 3 locations, 2 replications



Breeding lines of wheat (n≈400) and oat (n=266)

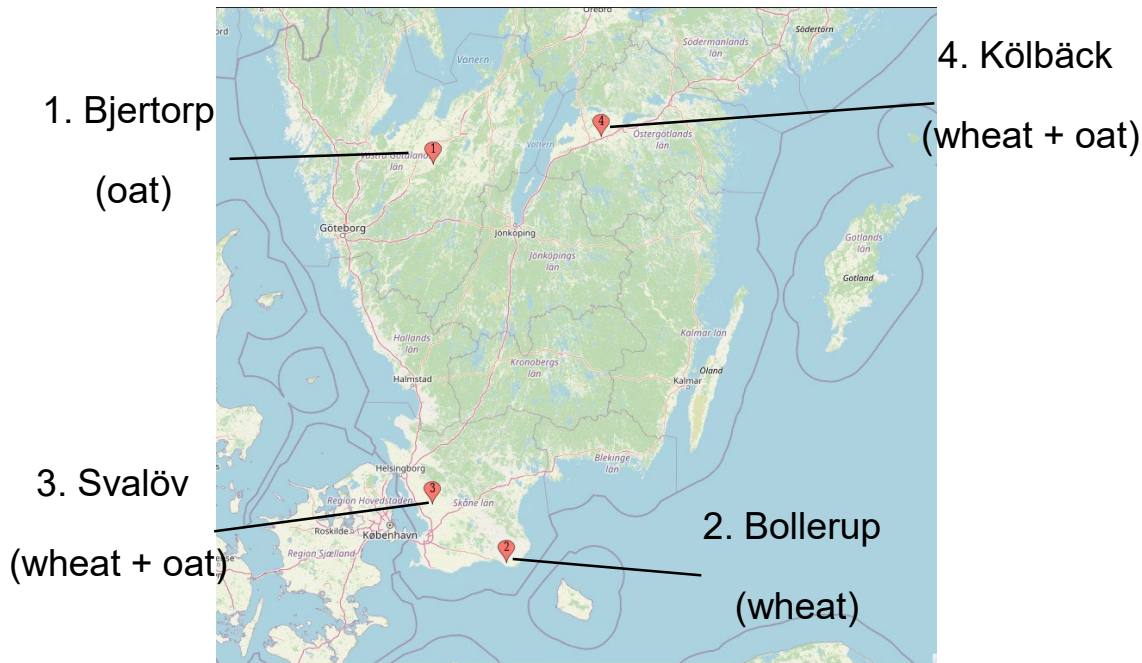
- Grain Cd, ear emergence, height & yield

Soil estimates:

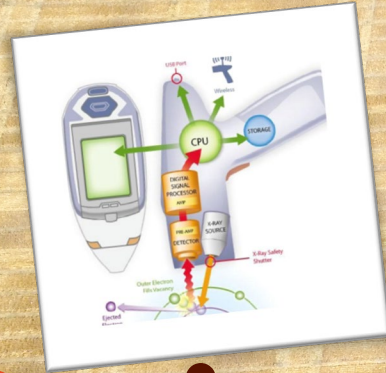
- Cd levels
- Clay content
- Organic matter content
- pH

Climate variables:

- Temperature
- Rainfall



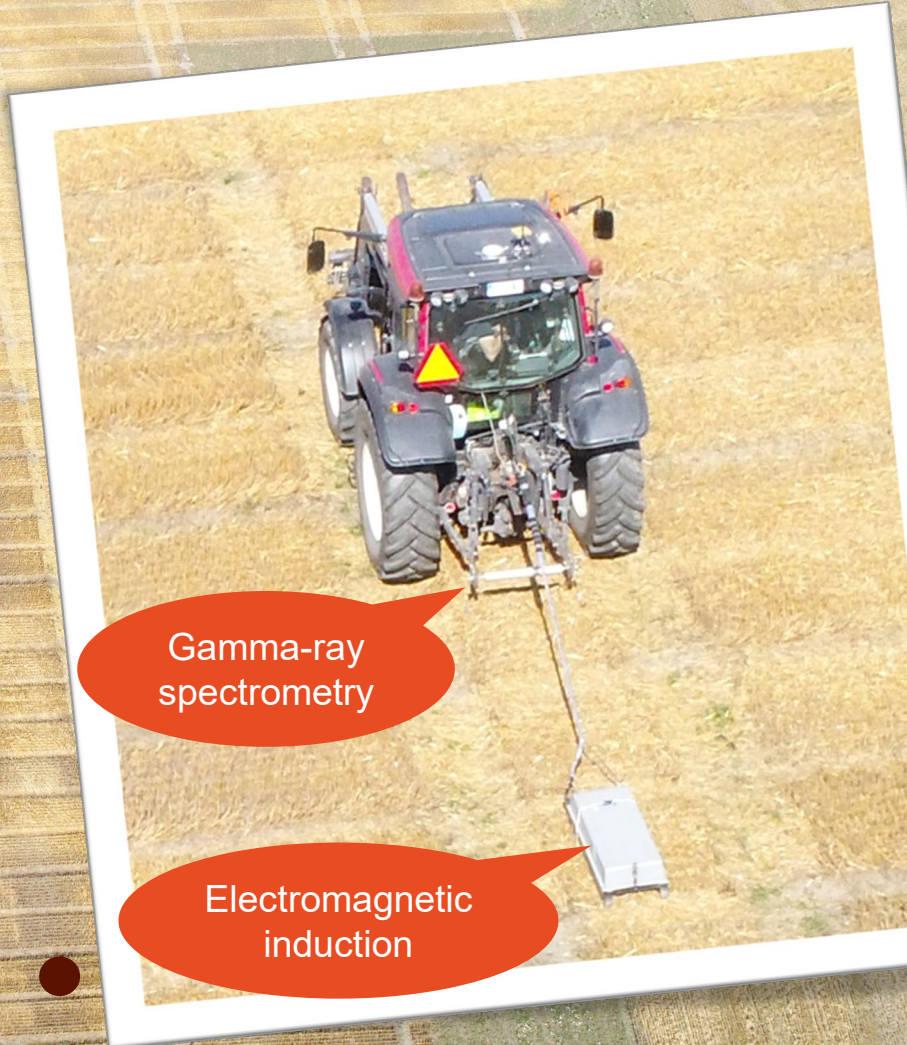
Predictions of soil Cd, pH, Clay content and SOM content in each parcel, two depths: 0-20 cm and 40-60 cm



Portable X-ray fluorescence on each sample

Budget limitation: soil samples from 25 locations per trial

Soil sampling + proximal sensor scanning of samples and fields + other covariates
→ Prediction modelling



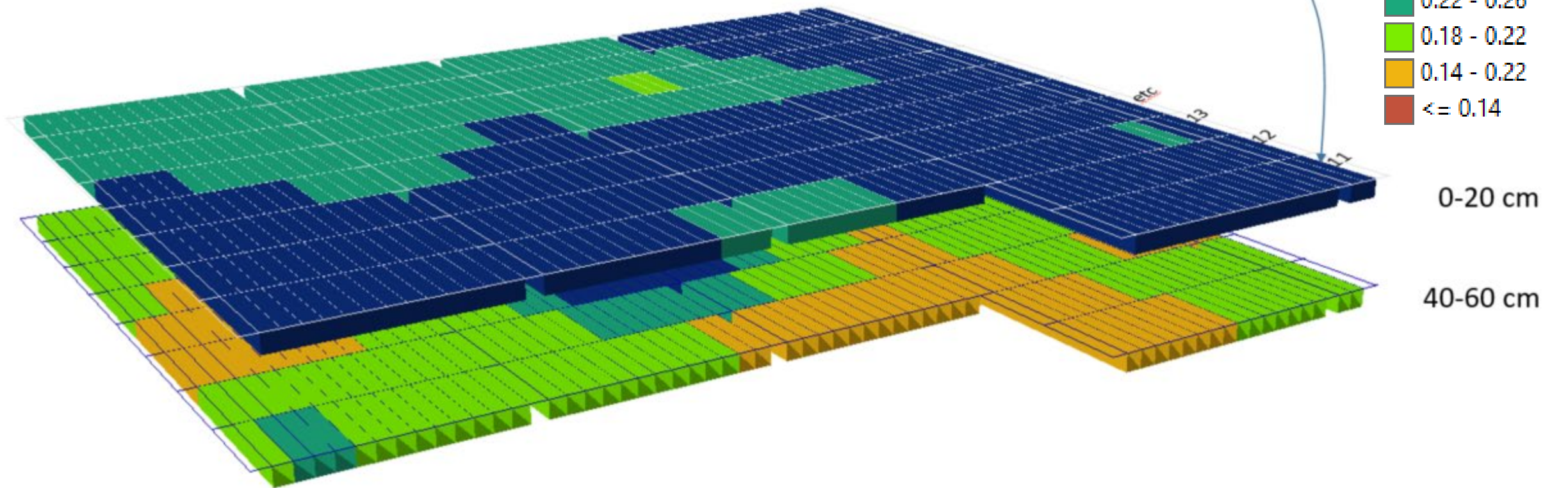
Gamma-ray spectrometry

Electromagnetic induction

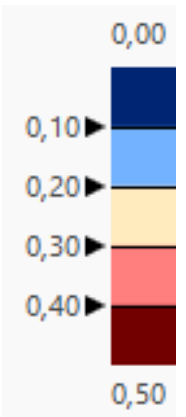
Predictions of soil Cd, pH, Clay content and SOM content in each parcel, two depths: 0-20 cm and 40-60 cm

Example

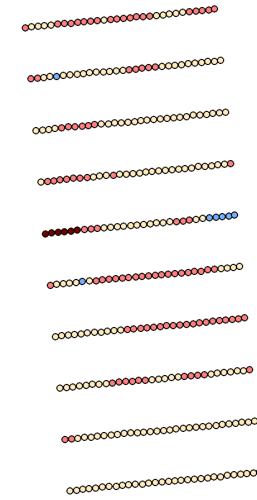
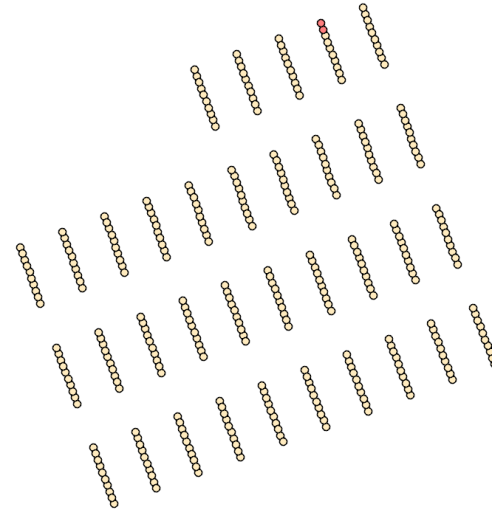
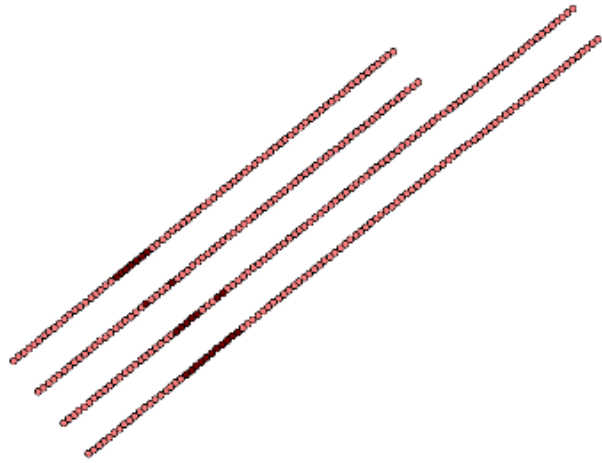
Plot id	Cd 020	clay 020	SOM 020	pH 020	Cd 4060	clay 4060	SOM 4060	pH 4060	Type
10									Border
11	0.28	17	1.6	7.2	0.19	24	0.7	7.4	Plot
12	0.28	17	1.6	7.3	0.19	24	0.6	7.4	Plot
13	0.27	17	1.6	7.3	0.17	25	0.3	7.5	Plot
etc									Plot



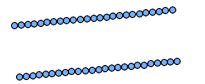
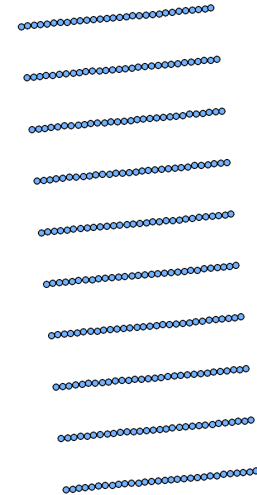
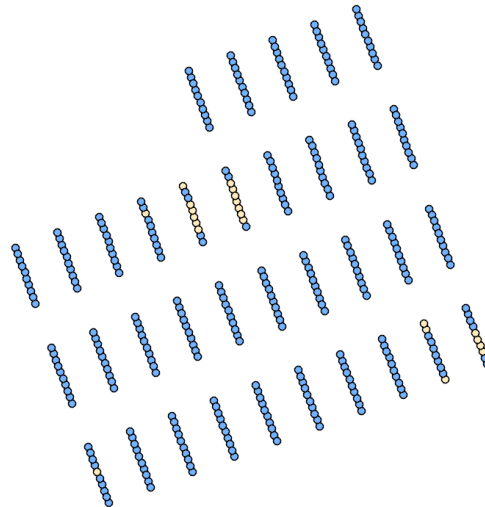
Predicted soil cadmium levels



**Topsoil
(0-20 cm)**



**Subsoil
(20-40 cm)**



Bollerup

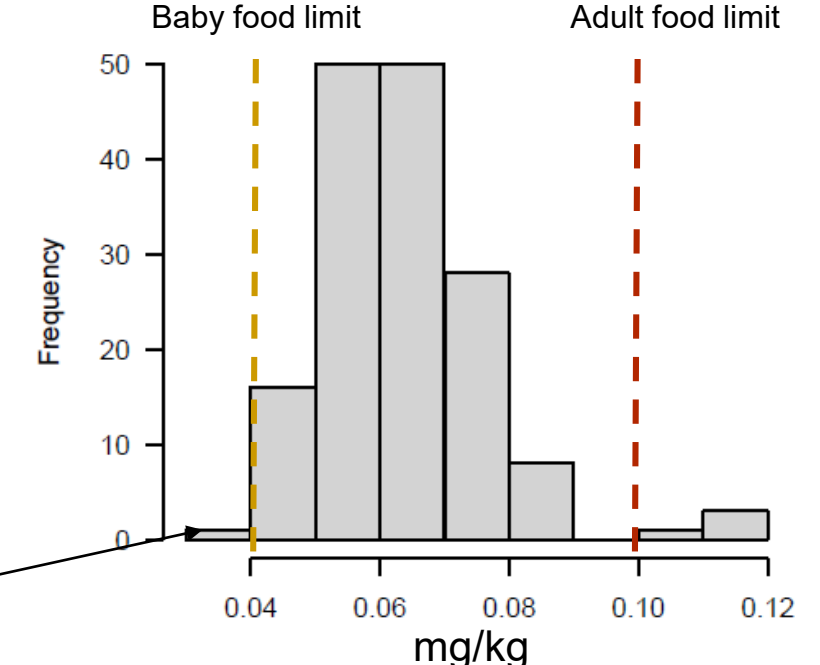
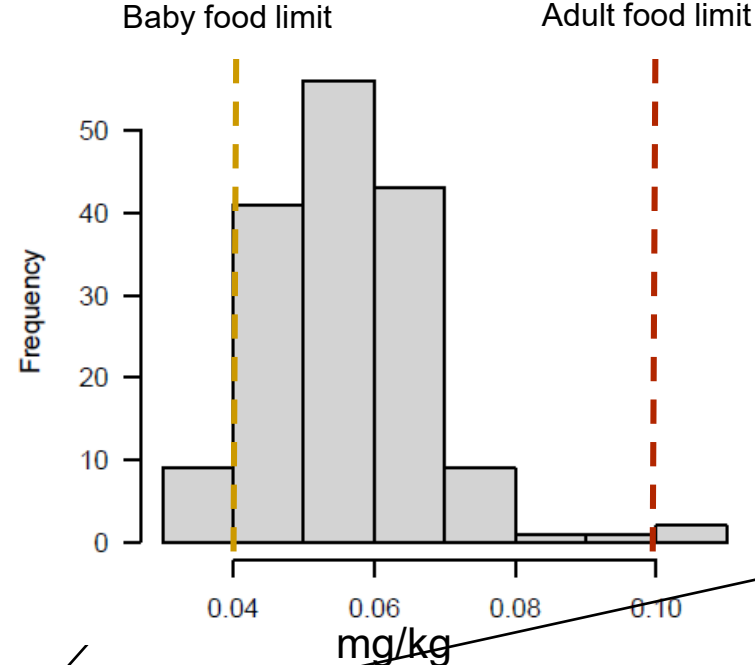
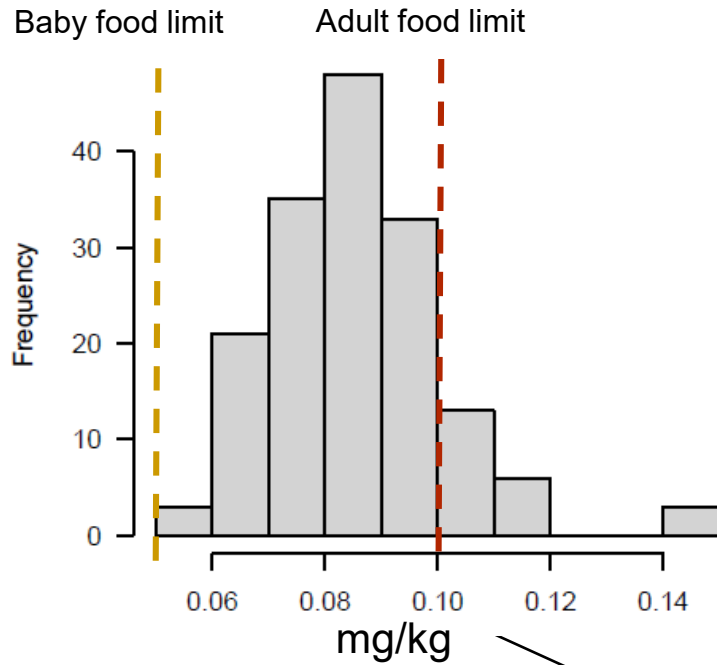
Svalöv

Kölbäck

GCd_Bollerup_BLUEs_cov

GCd_Svalöv_BLUEs_cov

GCd_Kölbäck_rep1



Ex. Wheat, 2022 (n=163)

One line in common

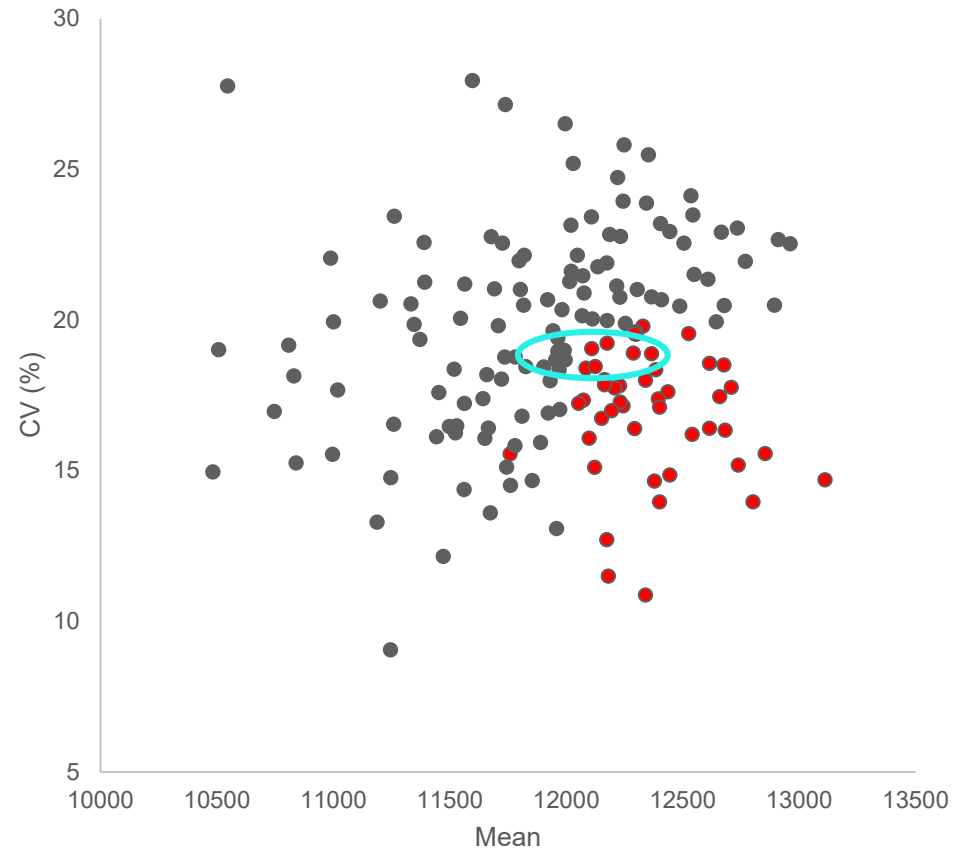
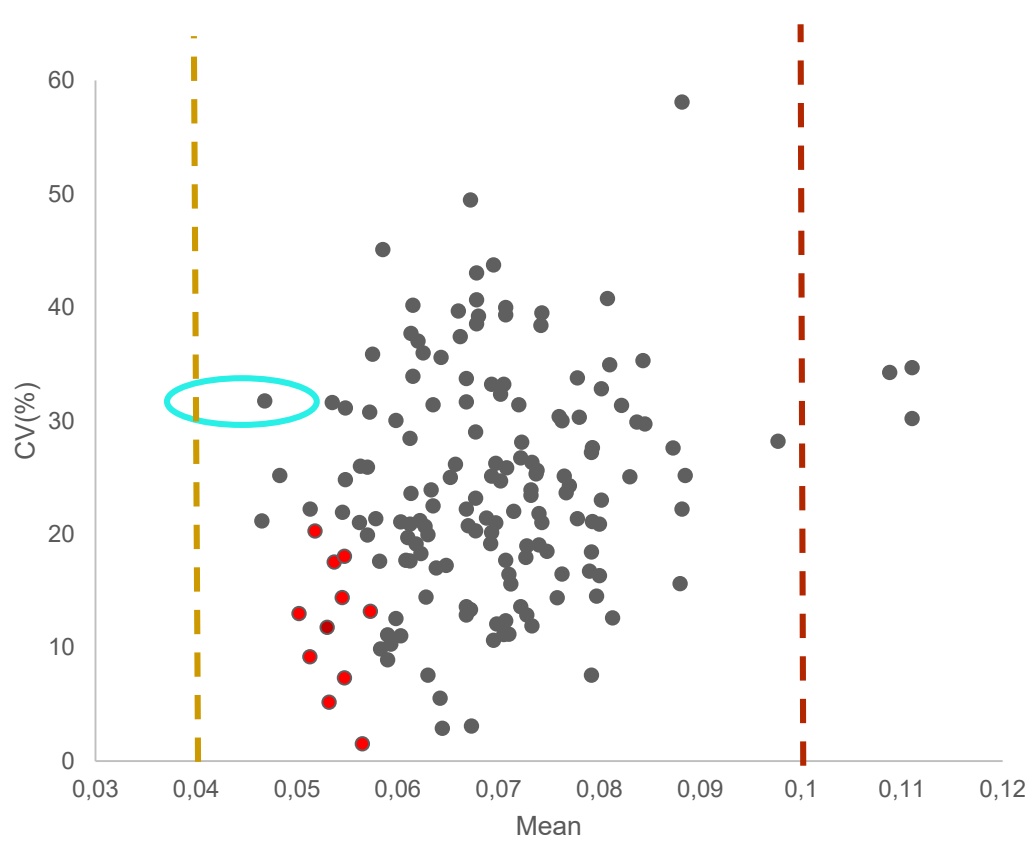
Bollerup: Soil characteristics		Svalöv: Soil characteristics		Kölbäck: Soil characteristics	
Level Top/Subsoil		Level Top/Subsoil		Level Top/Subsoil	
SCd	High/Medium	SCd	Medium/Low	SCd	Medium/Low
pH	High/High	pH	High/Medium	pH	Low/Medium
SOM	High/Medium	SOM	High/Low	SOM	Medium/Low
Clay	Low/Low	Clay	Medium/Medium	Clay	High/High

GCd (mg/kg)

Yield (kg/ha)

Baby food limit

Adult food limit

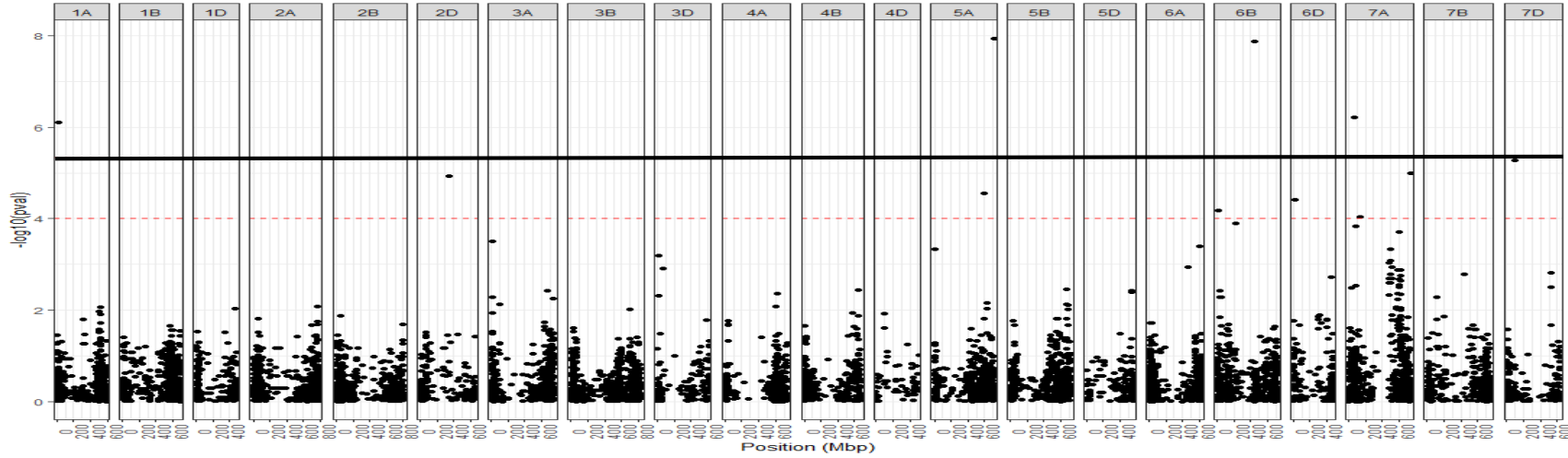


All three locations, 2022

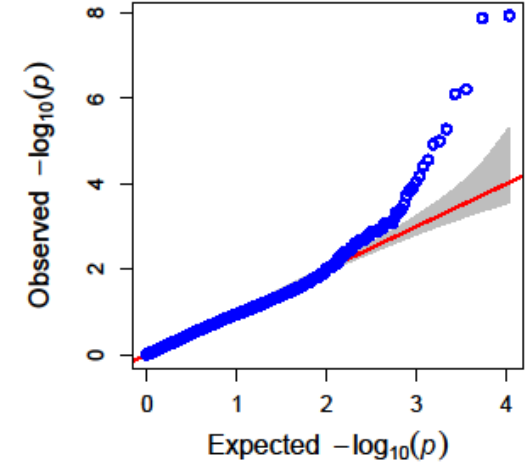


GCd_Bollerup_2022

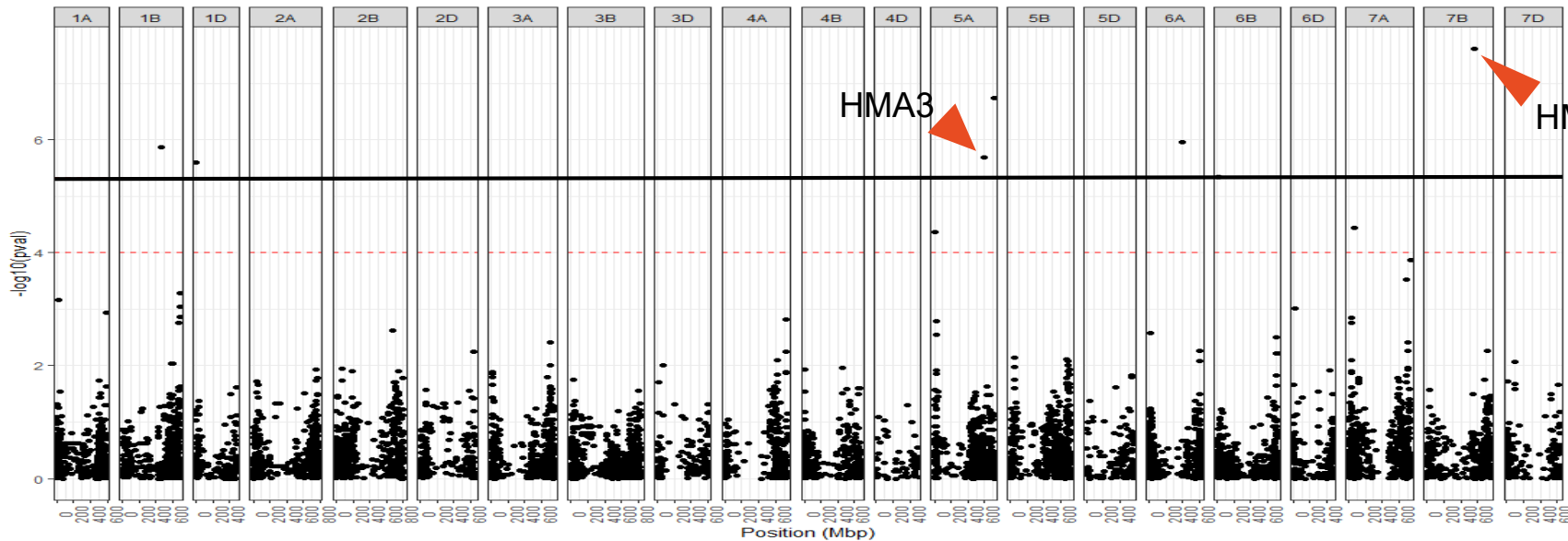
$H^2 = 0.92$



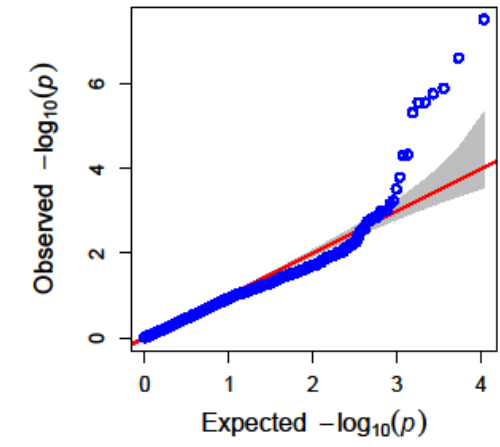
FarmCPU.BLUE_GCd_Bollerup_2022



GCd_Bollerup_2022_cov (SCd, SOM and clay → top soil) $H^2 = 0.93$

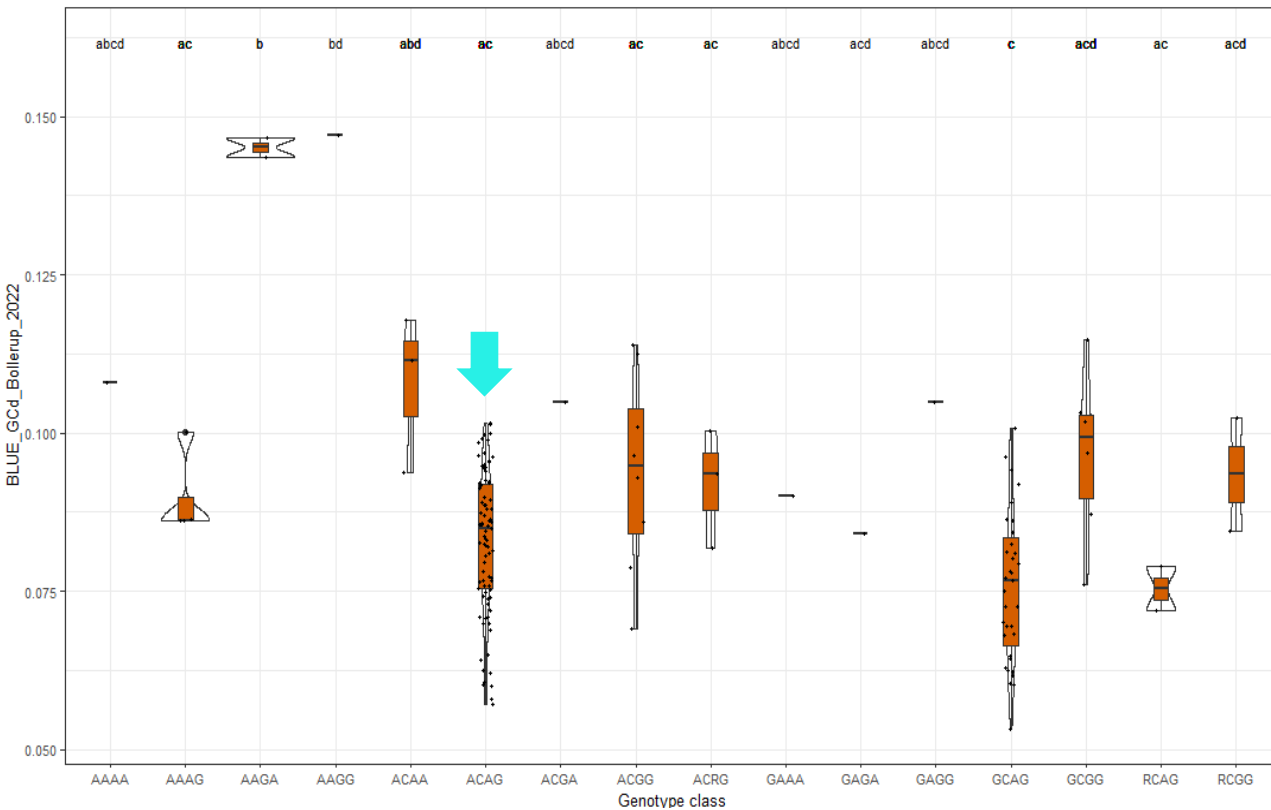


FarmCPU.BLUE_GCd_Bollerup_2022



Allele combinations using the model with covariates

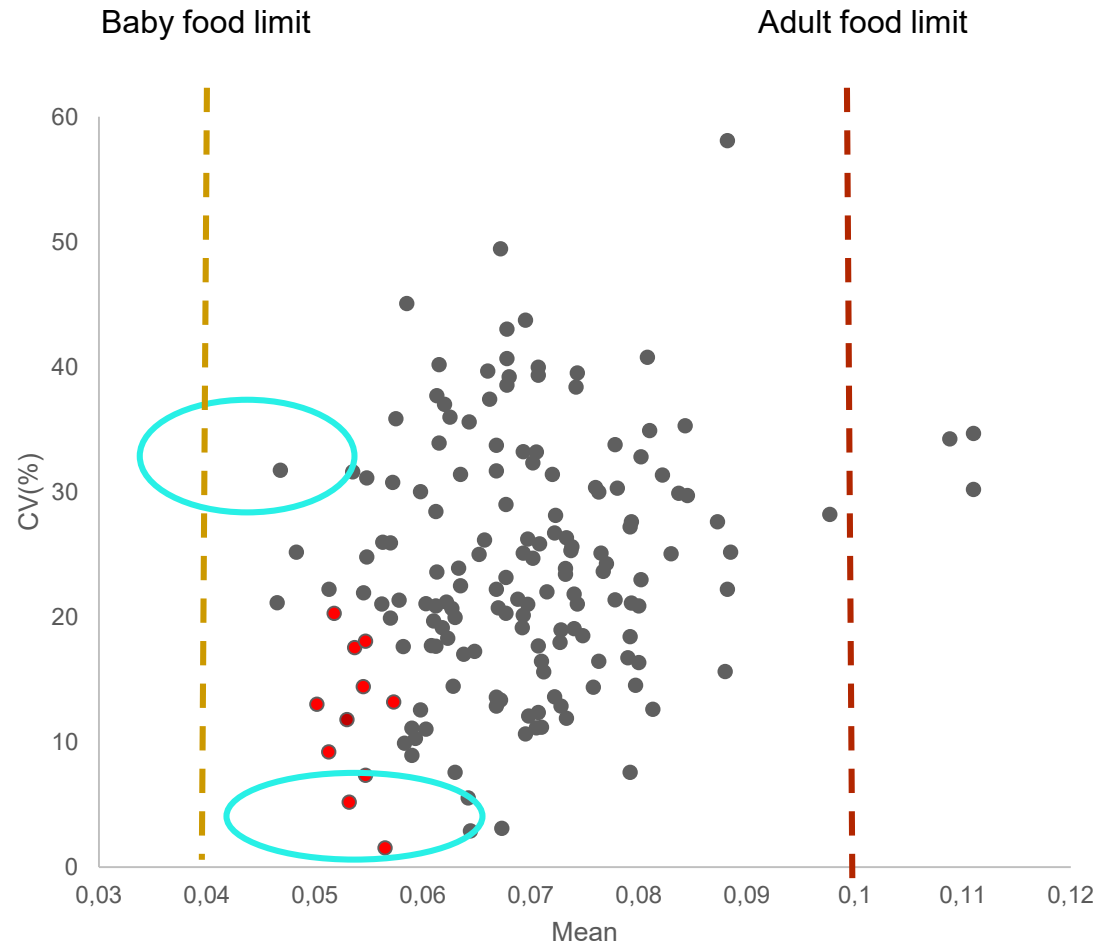
Top four markers



Chr	P.value	LOD	MAF
7B	2.440558e-08	7.612511	0.29012346
5A	1.845177e-07	6.733962	0.07407407
6A	1.118796e-06	5.951249	0.15740741
1B	1.378992e-06	5.860438	0.05555556
5A	2.086037e-06	5.680678	0.07716049
1D	2.499105e-06	5.602216	0.06172840

lines	Class	Phenotype
All	All	All
LM_210	ACAGCT	0.05993964
LM_211	ACAGCT	0.05703957
LM_212	ACAGCT	0.06031245
LM_212	ACAGCT	0.08800541

GCd (mg/kg)



All three locations, 2022



The way forward

- One more year of field trials
- Nutrient levels
- Develop genomic prediction models
- Identify covariates of highest importance
- Validate markers and implement tools at Lantmännen

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