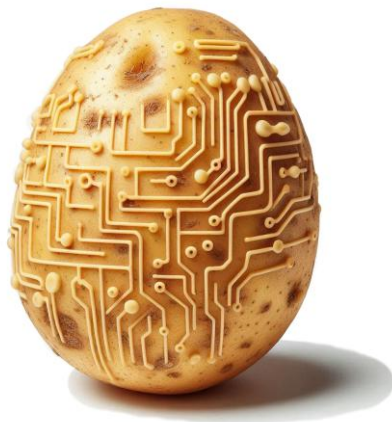




Analysing and predicting potato pests & diseases

Using data science and AI to strengthen the resilience of our potato industry

Peter Skelsey



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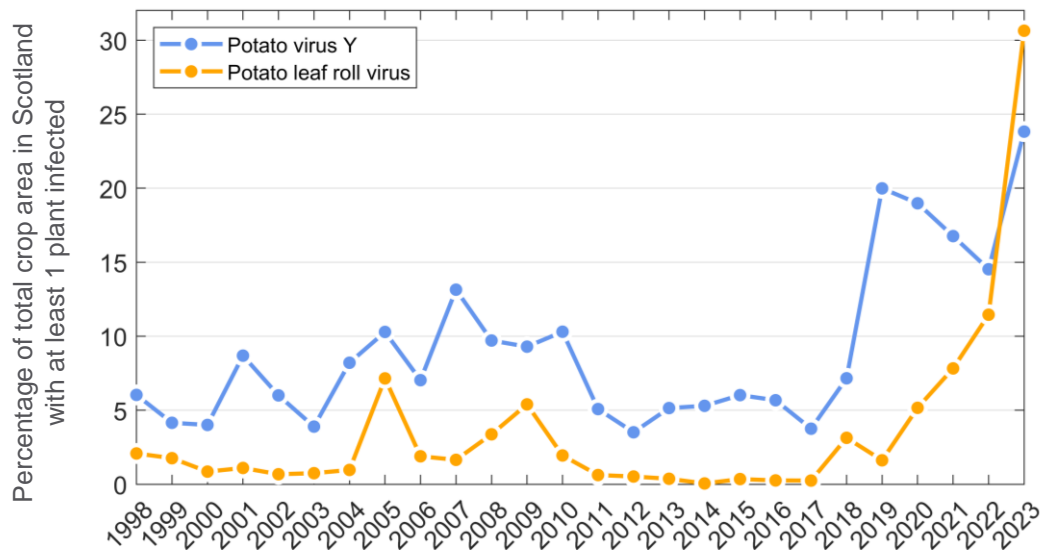


Potato pests and diseases - the problem

- Scottish potato sector is worth approx. £2bn per annum
 - ⚠ Potato viruses: a threat to our global reputation as a producer of high-quality seed
 - ⚠ Potato cyst nematodes: a soil pest that could collapse the seed industry by 2050
 - ⚠ Late blight: fungicide resistant / aggressive strains in Europe threaten our crops
- **We are using data science and AI to guide management and inform policy**

The potato virus problem

- Incidence of potato viruses has been increasing over the last 5 years
- The industry has expressed a need for a national evidence-based IPM strategy
 - This includes data analyses & models to inform decision-making



Potato virus data

- Scottish Seed Potato Classification Scheme, SASA
- Every growing seed crop inspected 2-3 times a season
- Data on 10 different potato viruses from over 100,000 crops (1998-2023)
 - *Never been analysed before!*

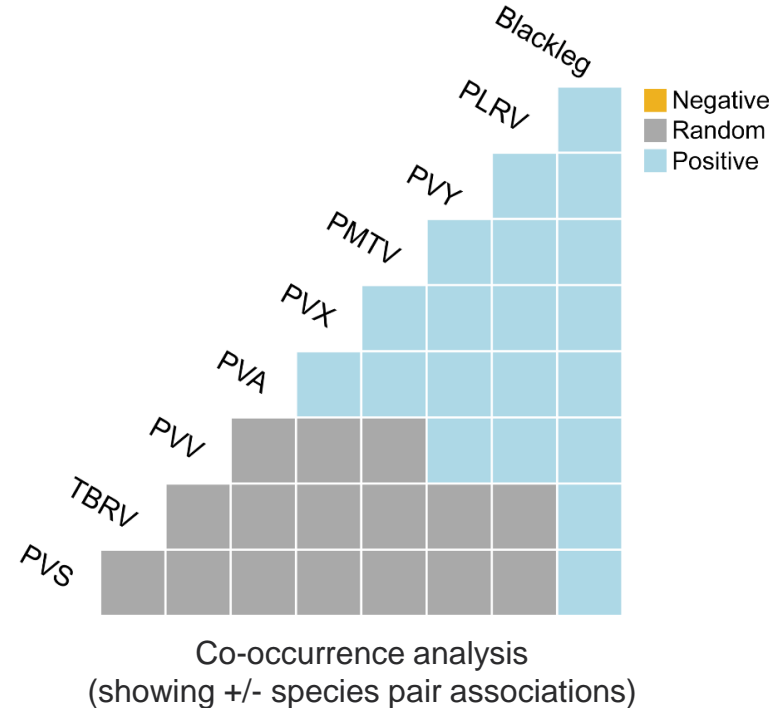
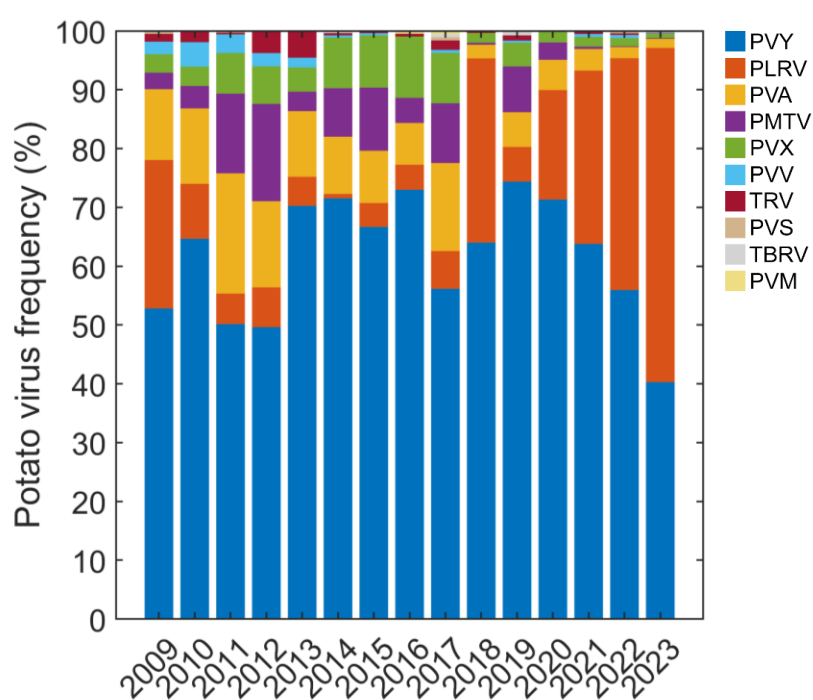


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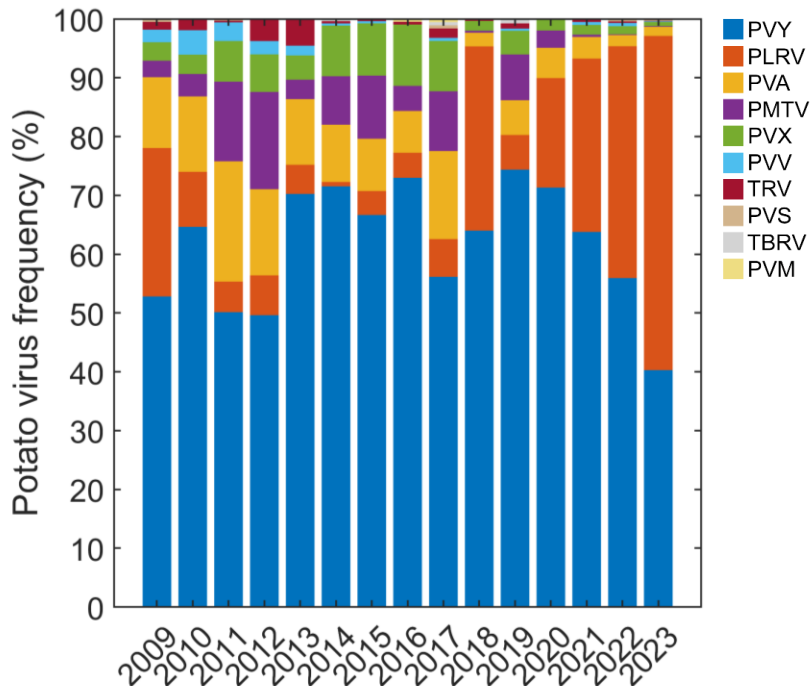
Describing and analysing potato virus data

- RESAS SRP 2022-2027, project JHI-A1-1: Epidemiology of key pests & diseases



Describing and analysing potato virus data

- RESAS SRP 2022-2027, project JHI-A1-1: Epidemiology of key pests & diseases



Number of infected seed lots (and %) of all infections							
Single infection	Double infection		Triple infection		Quadruple infection		
PVY	3549 (61.97)	PVY– PLRV (4.98)	PVY– PVA– PMTV (0.12)	7	PVY–PVA– PLRV–PVV (0.03)	2	
PLRV	767 (13.39)	PVY– PVA (1.55)	PVY– PVA–PVV (0.12)	7	PVY–PVA– PVX–PVV (0.02)	1	
PVA	331 (5.78)	PVY– PMTV (1.08)	PVY– PLRV– PVX (0.09)	5			
PMTV	202 (3.53)	PVY– PVX (0.65)	PVY– PLRV– PMTV (0.05)	3			
PVX	155 (2.71)	PVA– PVX (0.56)	PVY– PVA– PLRV (0.05)	3			
TRV	51 (0.89)	PVA– PVV (0.30)	PVY– PLRV– TBRV (0.03)	2			
PVV	31	PLRV– 11	PVY– 2				

Describing and analysing potato virus data

Variety-specific incidence rate 2023
(percentage of crops with at least 1 infected plant)

	<i>n. crops</i>									
Cara	19.9	50.6	1.8	0.0	0.0	0.0	0.0	0.0	0.0	342
Hermes	8.1	22.8	3.4	0.0	2.5	0.0	0.0	0.0	0.0	320
Maris Piper	30.8	39.2	0.0	0.4	0.0	0.0	0.0	0.0	0.8	237
Atlantic	39.5	16.1	0.0	0.8	0.0	0.0	0.0	0.0	0.0	124
Desiree	35.8	30.9	1.6	0.0	2.4	0.0	0.0	0.0	0.8	123
VR 808	42.7	3.4	0.0	0.0	0.0	1.1	0.0	0.0	0.0	89
Lady Rosetta	2.3	12.5	0.0	0.0	0.0	0.0	0.0	0.0	0.0	88
Markies	2.4	24.7	0.0	0.0	0.0	0.0	0.0	0.0	0.0	85
Brooke	14.5	18.1	0.0	0.0	0.0	0.0	0.0	0.0	0.0	83
Innovator	6.1	2.4	0.0	0.0	0.0	0.0	0.0	0.0	0.0	82
	PVY	PLRV	PVA	PMTV	PVX	PVV	TRV	PVS	TBRV	PVM

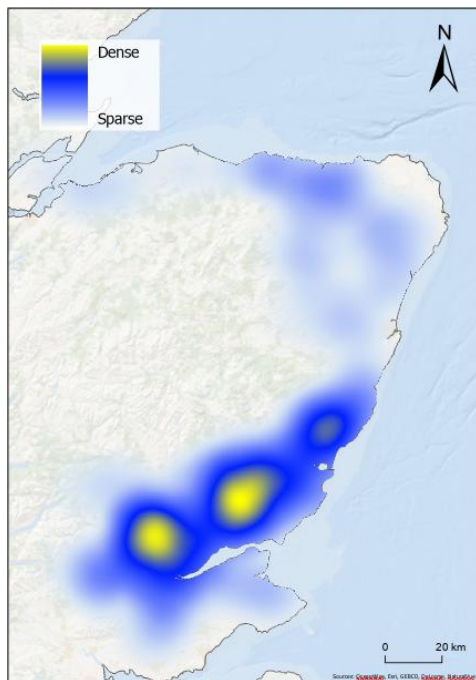
PVY incidence by field generation
(percentage of total faults attributed to FG)

FG1	0.9	0.0	0.3	0.2	0.2	0.0	0.2	pre-basic
FG2	3.8	4.7	4.2	4.0	2.4	4.2	8.7	
FG3	3.8	3.1	7.6	9.6	8.4	8.3	9.1	
FG4	14.3	13.5	19.9	19.2	20.7	14.9	20.8	
FG5	41.9	39.6	38.3	39.7	35.5	46.8	40.5	basic
FG6	23.8	31.2	22.3	21.1	26.5	21.2	16.2	
FG7	11.4	7.8	7.3	6.2	6.4	4.6	4.5	
	2017	2018	2019	2020	2021	2022	2023	

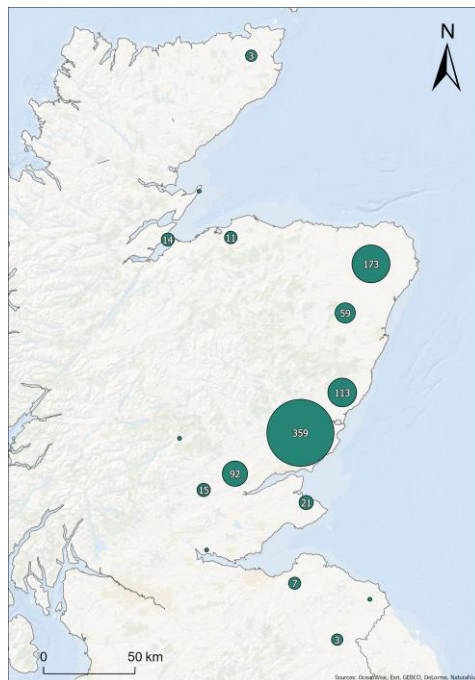
* colour-coded by column (virus)

Mapping potato virus data – getting an overview of the situation

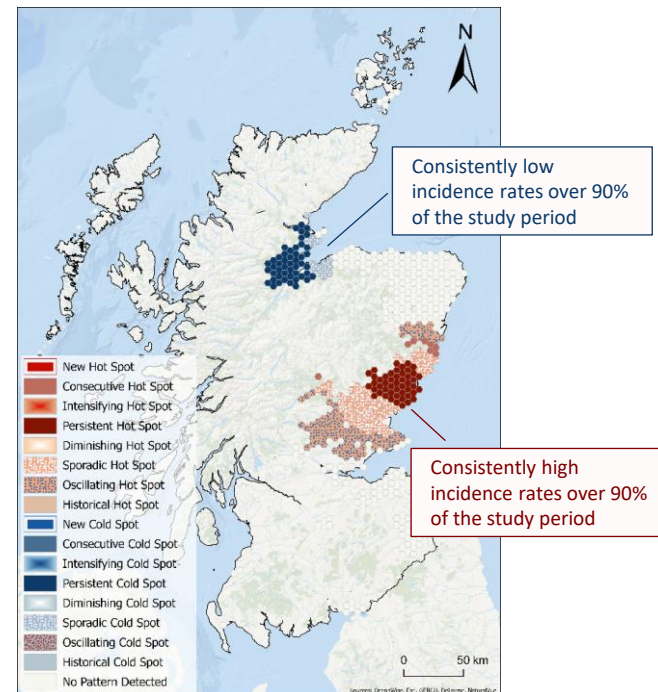
Density of PVY 2023



PLRV incidence 2023



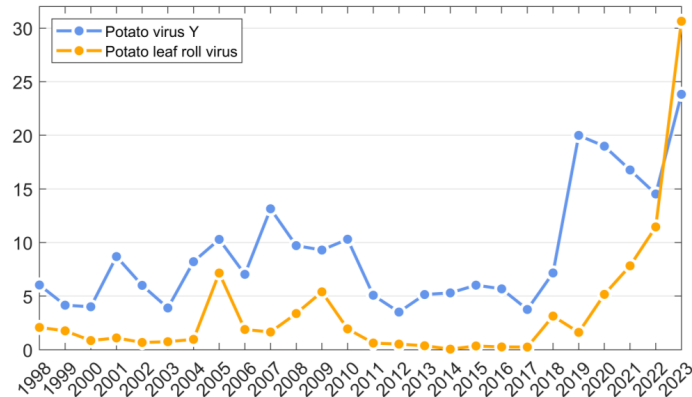
Spacetime patterns of PVY
in seed crops, 2009–2023



* 17 different types of spatiotemporal patterns

Implications for policy and the Seed Potato Classification Scheme

- Ware crops - compulsory use of certified seed & increased crop separation distances
- Field generations - revisit the virus tolerances set in the SSPCS
- Seedborne infection - improved post-harvest tuber-testing to flush virus out
- Varieties - restrictions on poorly-performing varieties
- Region-specific rules – e.g., an extra inspection or incentives in hot-spot areas



Forecasting potato virus risk – new AI-based national warning systems

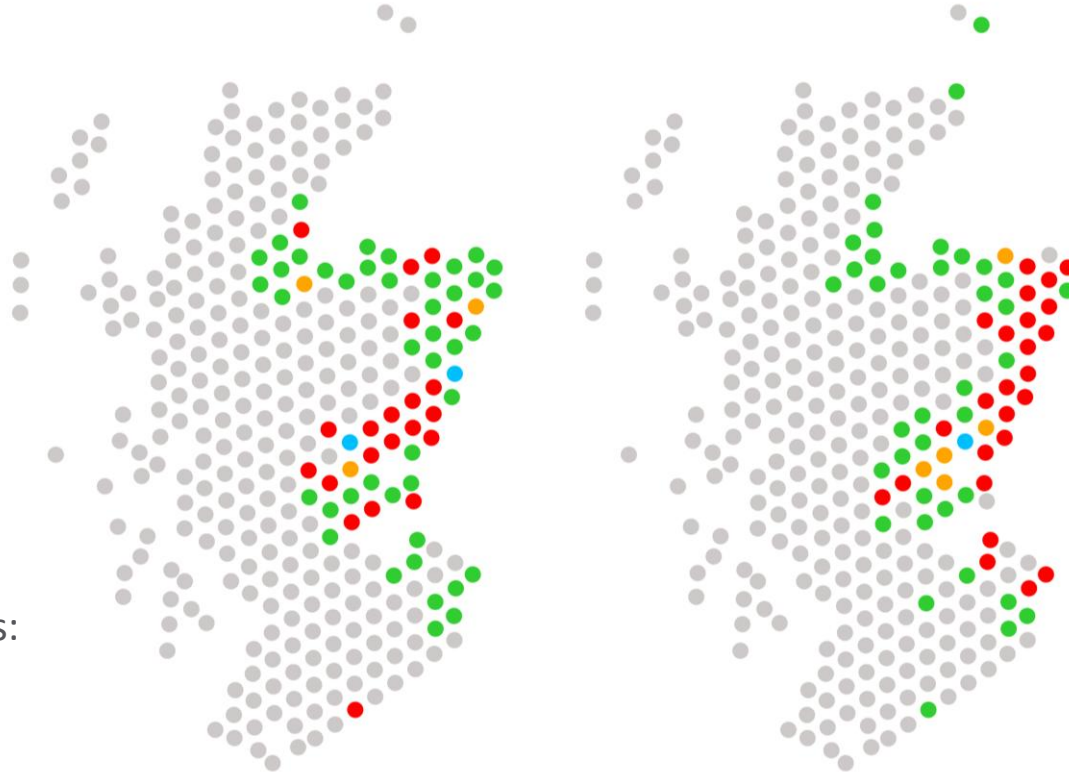
- Leveraged funding, PHC Project, 2024 – “*Potato virus forecasts: developing new models to guide sustainable management of potato crops in Scotland*”
- Stakeholder focus group – wanted a ‘green alert’ / ‘red alert’ system
- Data – 25 years of national virus levels, 25 years of national aphid vector counts
- Modelling task - *will virus levels next year be lower or higher than the average season?*
- Tested > 25 different AI algorithms:

Performance of AI models for predicting virus risk

Virus & Algorithm	True negative rate	False negative rate	True positive rate	False positive rate	Accuracy
PVY: Support Vector Machine	98%	4%	96%	2%	97%
PLRV: Decision Tree	97%	5%	95%	3%	96%

Forecasting potato virus risk – new AI-based local warning systems

- True positive
- False positive
- True negative
- False negative

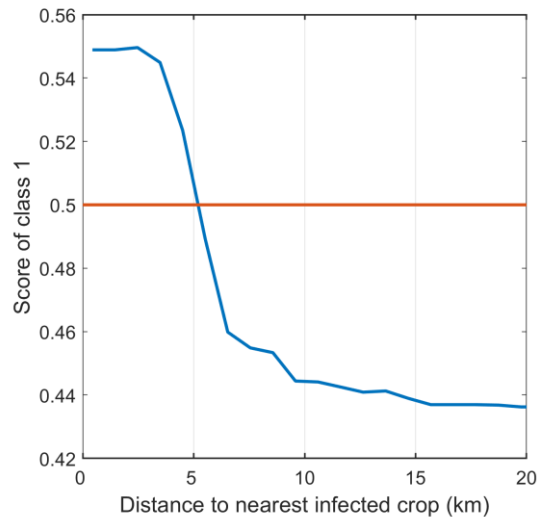
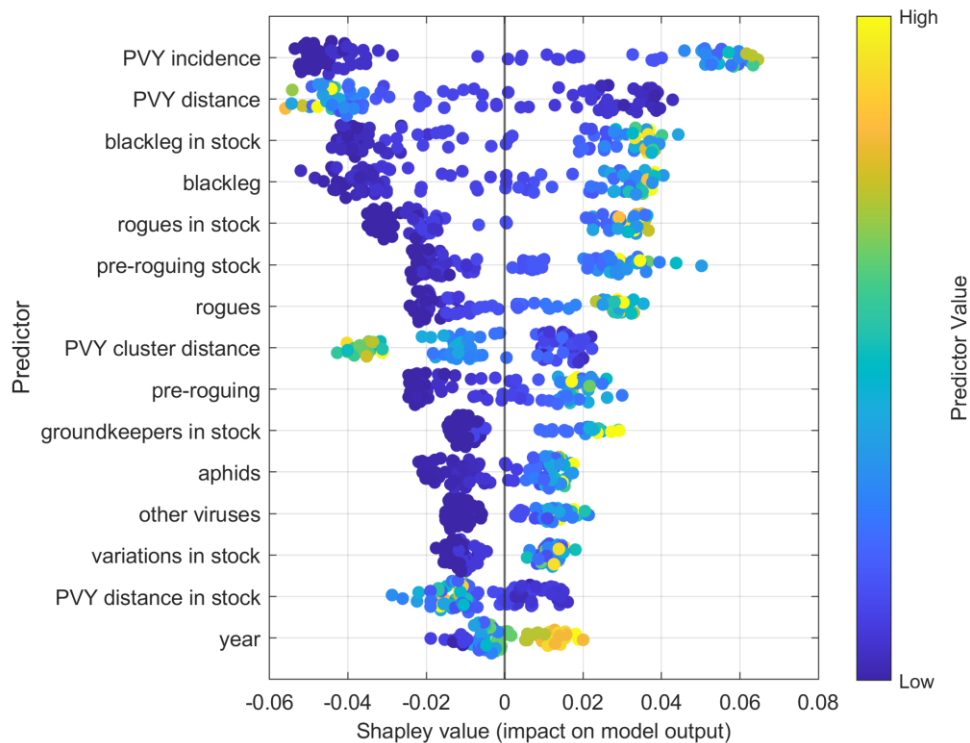


Random Forest models:
~85% accurate

PVY 2012

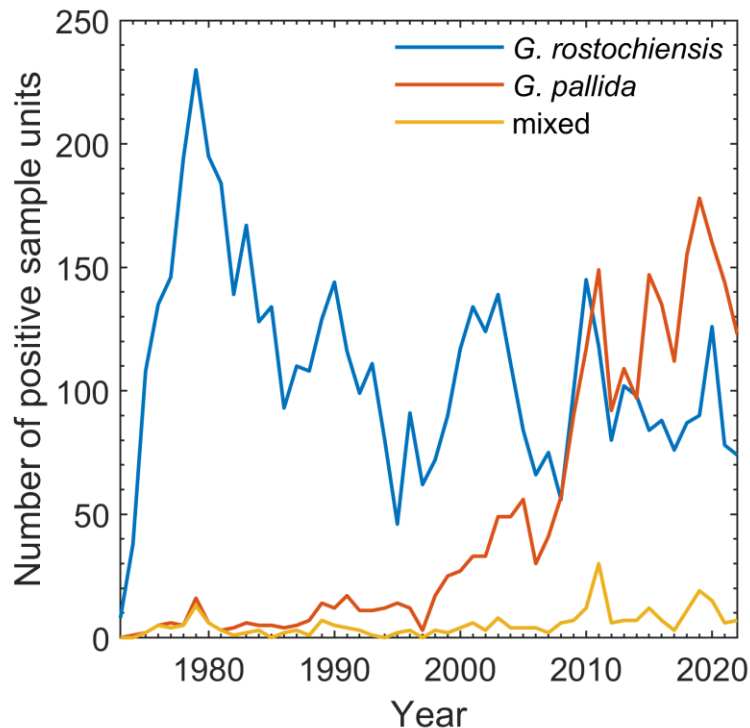
PLRV 2021

Forecasting potato virus risk – PVY local model interpretation



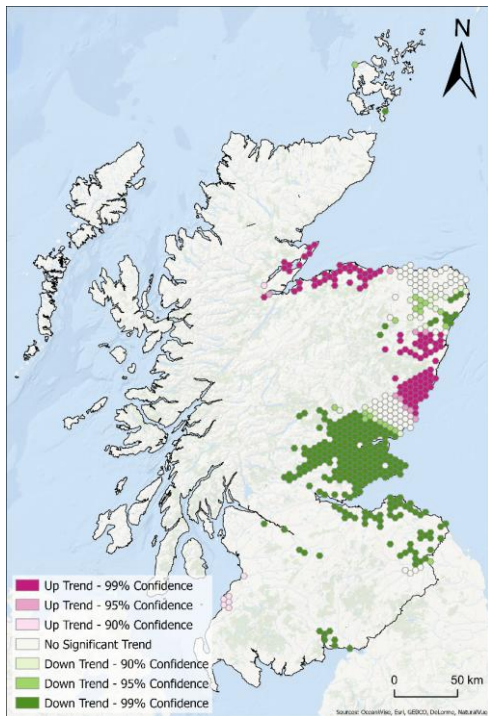
Potato cyst nematodes - statutory PCN testing data

- Seed potatoes can only be grown on land that is PCN-free
- PCN is already present in ~25k ha of Scottish soils
- The cysts can survive for many years, and the amount of infested land is doubling every 6-7 years
- Recent predictions suggest PCN will cause the end of the seed industry by 2050
- Analysing the statutory soil testing data 1973-2022 (~100k sample units)



Potato cyst nematodes – mapping and modelling

Spacetime patterns of *G. rostochiensis*



↑
Moving north due
to climate change

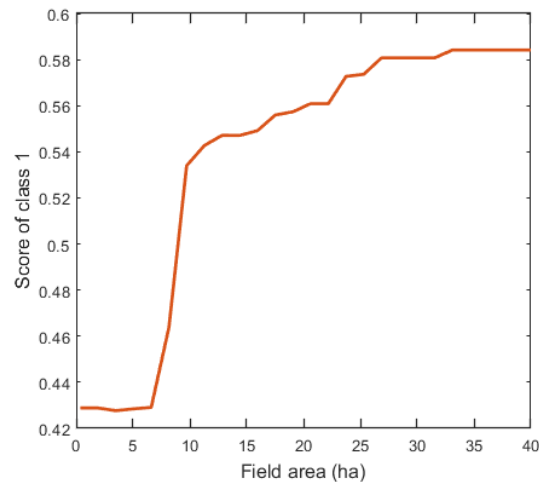
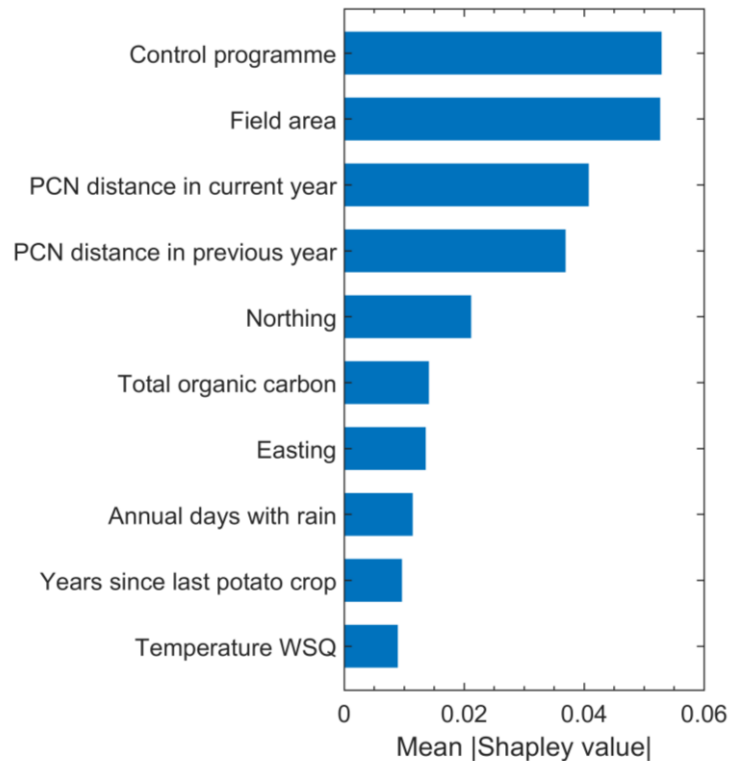
Performance of an AI model to predict
whether a soil sample will be positive or
negative for PCN

Random forest model	Balanced accuracy
Training results	93% (2%)
Test results	91% (5%)
Final model	97%

= a new tool for industry

= identify problematic areas & new insights

Potato cyst nematodes – model interpretation



Potato cyst nematodes – new funding for an AI model

Leveraged SG / PHC call-down funding 2024

- Project title: *“Developing new AI models to predict PCN species presence / absence in Scottish soils”*

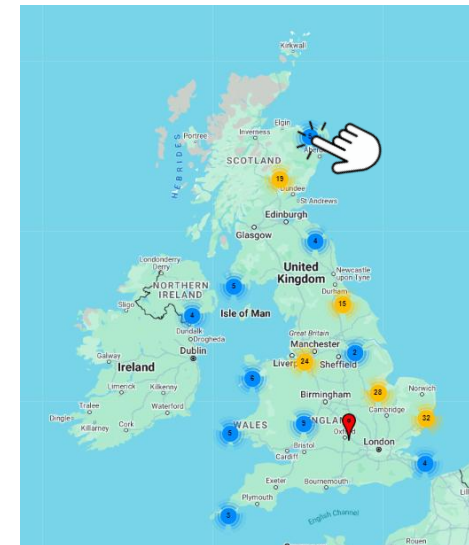
Implications for industry / policy

- Develop spatial, species-specific management strategies
- Model could help reduce costs of testing
- Make predictions for ware areas
- Increase sustainability of our potato industry

Potato late blight – Fight Against Blight campaign

- Running since 2004 (PCL / AHDB Potatoes), now operated by Hutton
- Blight scouts submit samples of suspected outbreaks:
 - Monitoring pathogen populations (genotyping)
 - Virulence to new blight resistant cultivars
 - Sensitivity to key fungicides
 - Sensitivity to environmental conditions
 - Comparing to European populations (EuroBlight database)
- Results are fed back to the industry to keep them informed
- **Can we predict late blight genotypes?**

Blight services at JHI



Potato late blight – predicting the genotype of outbreaks

- Developed an AI model to predict the genotype of potato late blight outbreaks
= 98% accurate

Artificial Neural Network

Observed genotype	13_A2	36_A2	37_A2	6_A1	8_A1	Other
13_A2	522	3	11	40	6	2
36_A2		1132	2	14		2
37_A2	4	4	277	14		3
6_A1	21	7	10	2085	3	2
8_A1	7		1	6	129	2
Other	1	3		9	5	660
	13_A2	36_A2	37_A2	6_A1	8_A1	Other
	Predicted genotype					

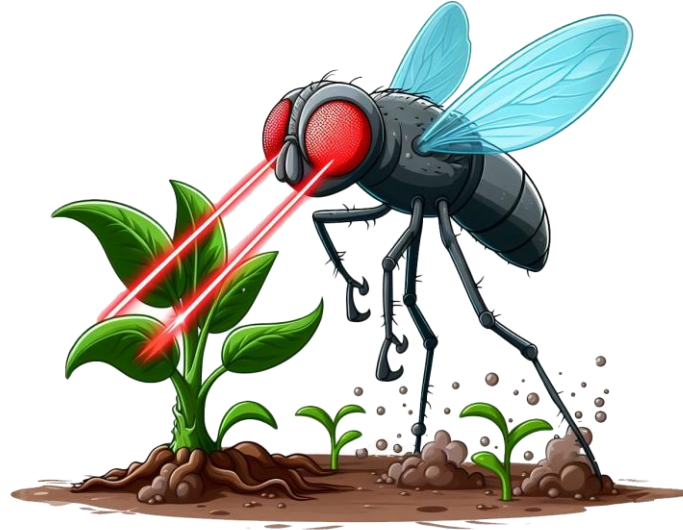
Implications for industry / policy

- Faster than sampling
- Provide predictions for crops that weren't sampled
- Inform growers which fungicides to use & when to use their premium products
- Inform growers of their chances of resistance failing

Thank you for listening ...



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