

# VegCast: Modelling Broccoli Data for Forecasting

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# Overview: the VegCast project

- ▶ VegCast is funded by Ceres and is a collaboration between University of Lincoln (led by Simon Pearson) and University of Reading (led by Paul Hadley)
- ▶ **Problem:** An accurate model is needed to provide yield forecasting for broccoli, in order to match supply with demand.
- ▶ **Solution:** VegCast will provide a user-friendly digital forecasting system that predicts timing and yield estimates, and associated uncertainties.
- ▶ **Status:** Project just completed first quarter

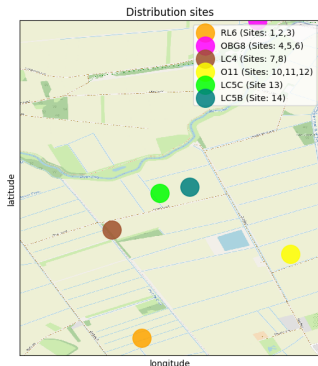


# Data & Project focus

- ▶ Data sets to be considered in VegCast:
  - ▶ Manually collected measurements of broccoli head size, from 2020 (UK) and 2021 (Spain and UK)
  - ▶ Scanned broccoli plants using 3d scanner equipped in a rover.
  - ▶ MET weather data
  - ▶ Weather station data (from Soil Moisture Sense: <http://soilmoisturesense.com/>)
- ▶ Focus of this talk:
  - ▶ Manual data from 2020
  - ▶ EarthRover data from 2020

# Experiment set up: Manual data from 2020

- ▶ Manually collected data gathered from 14 different sites at 6 different locations (fields).
- ▶ Each site contains a single broccoli variety. 5 different varieties of broccoli (Ironman, Parthenon, Steel, Titanium, Triton).
- ▶ Data collected over 10 weeks.



- ▶ Circular areas are the location (field) from where the manual data was collected.
- ▶ Each location has different varieties (sites)

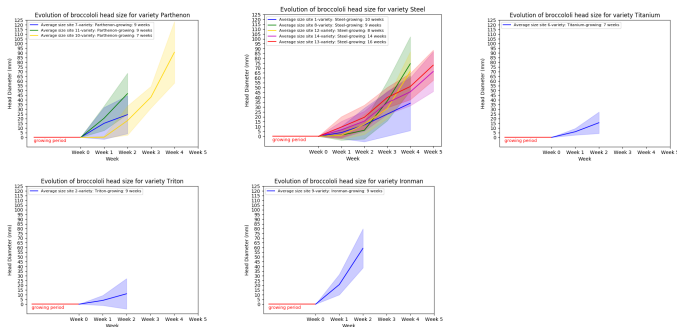
# What are we measuring and what are we trying to predict?

- ▶ **Broccoli head size.**
- ▶ Which variables have an impact in the Broccoli head size?.



# Growing patterns based on the variety

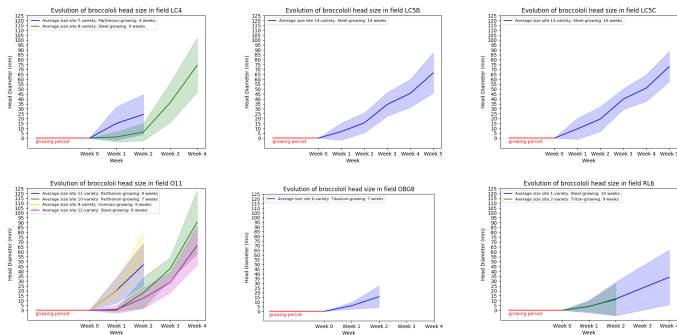
- ▶ Similar growing patterns among sites with the same variety.
- ▶ Some varieties have similar growing patterns
- ▶ Growing patterns depend on the varieties.



**Figure:** Varieties: Parthenon, Steel, Titanium, Triton, Ironman

# Growing patterns based on location

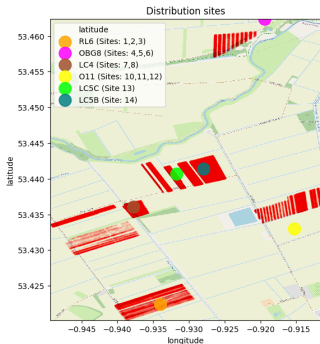
- ▶ Each location(site) present similar irrigation and plant treatments.
- ▶ Different broccoli varieties within same site follow similar growing patterns.



**Figure:** Fields: LC4, LC5B, LC5C, O11, OBG8, and RL6

# Experiment set up: Rover data from 2020

- ▶ Over 2 million of 3D scanned broccoli plants.
- ▶ Extract information from 3D scans and verify it with the 2020 manual data.
- ▶ Large number of samples will help to identify complex growing patterns in broccoli plants.



- ▶ Red areas indicate the location of the scanned broccoli plants.
- ▶ Not all the scanned plants come from the manual data sites.



# Conclusion, further steps & challenges

## So far

- ▶ Evaluate sources of variability in growing patterns of broccoli plants (to included in predictive models).
- ▶ Acquire large broccoli datasets.

## Further steps

- ▶ Matching and verifying rover data from 2020 with the Manual data from 2020.
- ▶ Include new information (weather, plant treatment...).

## Challenges

- ▶ Time-series models that output uncertainty estimates.
- ▶ Include uncertain dependent variables in prediction models, e.g. future weather data.
- ▶ Deal with missing data, e.g. plant treatment information is not available.