

A photograph of a butterfly with orange and black wings perched on a green leaf. The background is dark and out of focus, showing more foliage.

The butterfly effect

A Case for Biodiversity using Machine Learning

What are we looking at?



6,392,186
butterfly sightings



2001 - 2020



United Kingdom

From: [UK Butterfly Monitoring Scheme](#)



6,392,186
butterfly sightings



2001 - 2020



United Kingdom

Dataset 1 is merged with:



Weather data

- Temperatures
- Rain
- Sun
- Air Frost



Air Quality data

- Ground Level Ozone (O₃)
- Nitrogen Dioxide (NO₂)
- Sulphur Dioxide (SO₂)
- Particles (PM₁₀)
- Carbon Monoxide (CO)

From: [Met Office](#)

From: [London Air Quality Network](#)

What do we want to predict?

Using a **Time Series model**,

an **estimation of the butterfly population evolution** over the next years

In the context of **climate change**

How?



> An **interactive tool** designed to **facilitate a deeper understanding** of the relationship between our **evolving environment** and its **impact on biodiversity**.

Indicator for Butterfly population



Butterfly sightings
(total of 6,392,186)

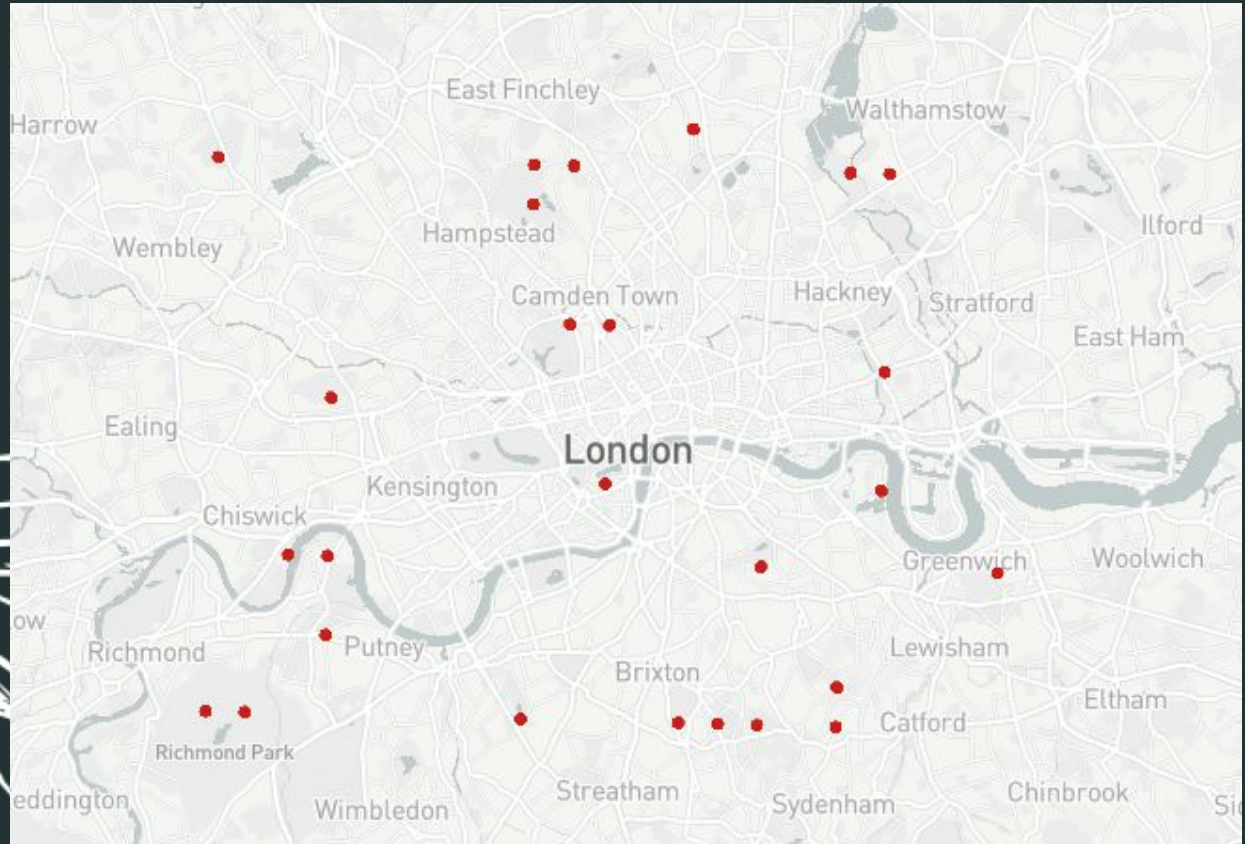


Surveys
(total of 381,276)

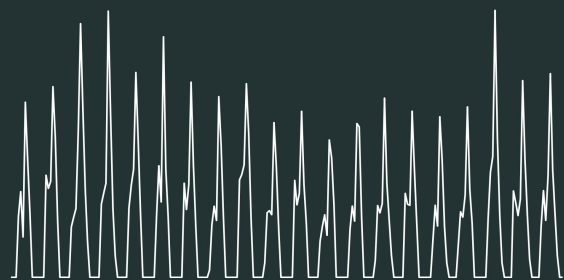


Butterflies seen per Survey
(average of 16.8)

Focus on London Sightings



All data



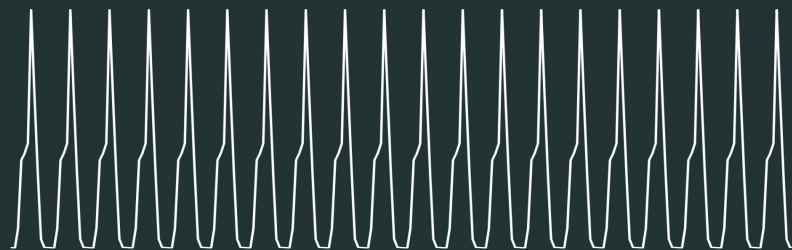
2001

2020

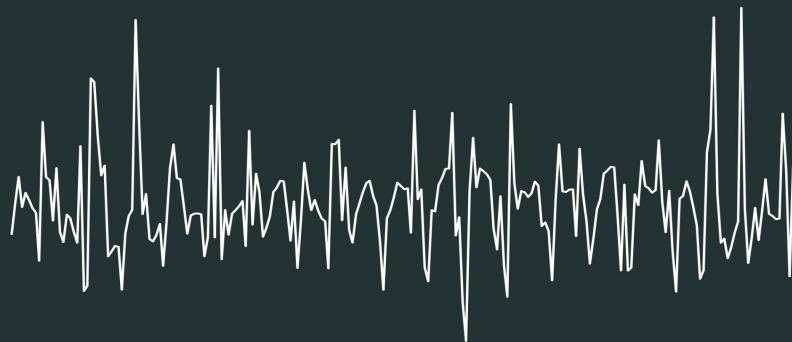
Trend



Seasonality



Residuals



Models

Complexities of Predicting Biodiversity Population Evolution

COLLECTING DATA

- Counts: Warm weather leads to some butterfly species being past their peak in numbers by the time the surveys start each year
- Population estimation: impossible to account for all butterflies
- Human observation: the methods for collecting data are very thorough at the UK Butterfly Monitoring Scheme, but approximations due to human action are still possible

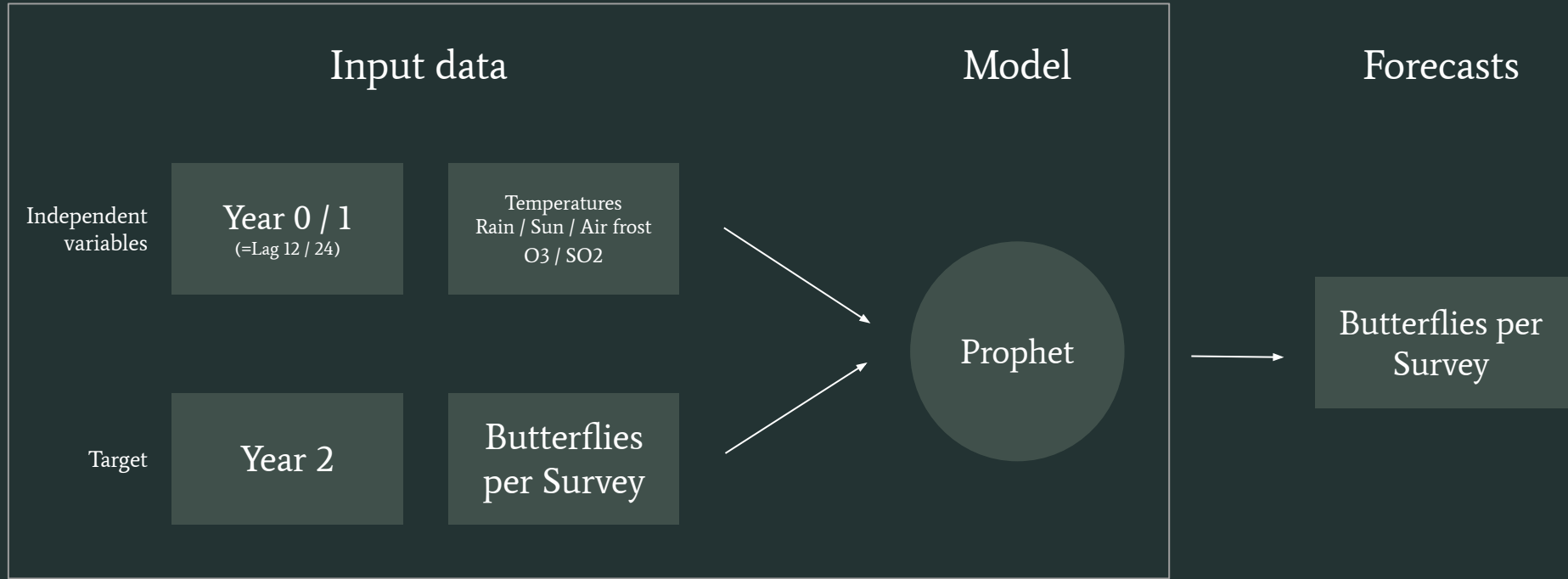
UNDERSTANDING GLOBAL DYNAMIC FROM DATA

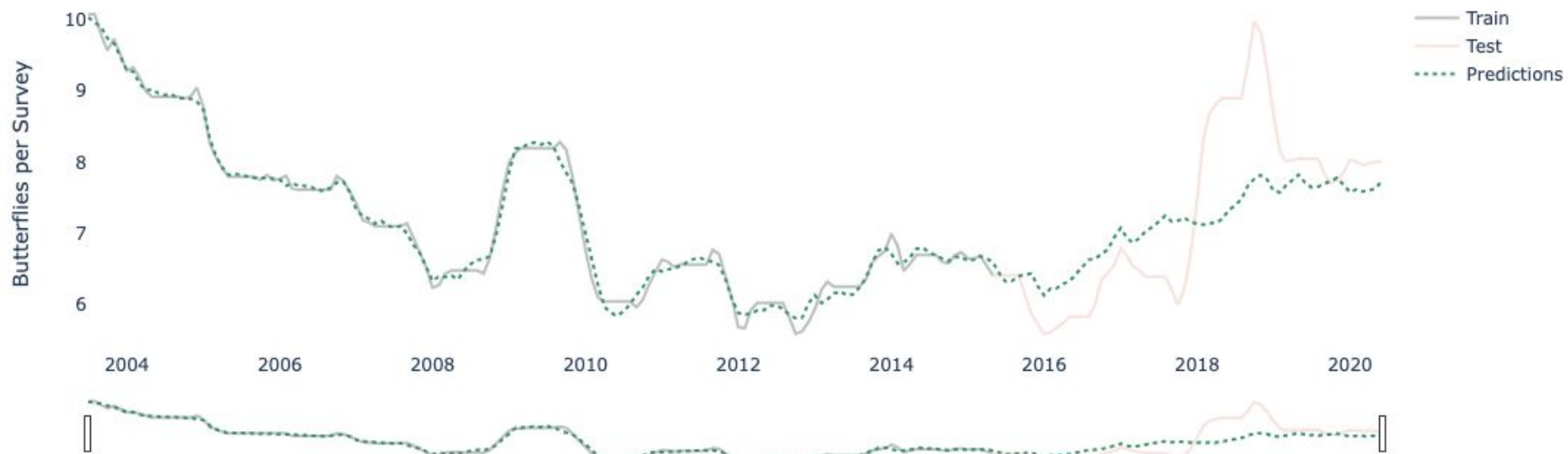
- External factors: not only weather and air quality factors, but also conservation efforts, population migration, plants density...

Models results

	Univariate models		Multivariate models	
	ARIMA	Prophet	Prophet	Prophet
Input data	–	–	All variables Lags = 12	Some variables Lags = 12
MAPE train	1.7%	5.2%	1.3%	1.2%
MAPE test	24.4%	11.4%	19.9%	8.8%
Delta MAPE train/test	22.7%	6.2%	18.6%	7.6%
Notes	Predictions line somewhat “flat”: no variation in the last 8 years			

Best data / model combination





MAPE Train set: 1.24%

MAPE Test set: 8.81%

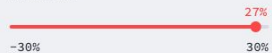
Forecasts

Model filters

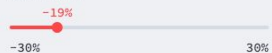
Temperature variation



O3 variation



SO2 variation



Data Sources

Butterfly sightings data: [UKBMS](#)

Weather data: [Met Office](#)

Air Quality data: [London Air](#)

A multivariate Time Series model aimed to predict the Butterfly Population Evolution amid climate change (a focus around London, UK) - using Facebook Prophet model

The Butterfly Effect

Butterflies population evolution estimation trend in London, UK



Train set MAPE: 1.23% | Test set MAPE: 8.93% | Difference in accuracy between train and test sets: 7.7%

> Streamlit app

Thanks!