

PROJECT INFORMATION

Project title: **Assessment of weather typologies and remote sensing data to explain and predict acorn production in *Quercus robur* and *Quercus petraea***

Project ID: 232

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PROJECT DESCRIPTION

Motivation

Weather is thought to be a key proximate factor in mast seeding, in part due to its ability to act as a large-scale synchroniser of masting events (Norton and Kelly 1988; Bogdziewicz et al. 2017, 2021). Current studies on the influence of the weather on masting species' reproduction give varied, and occasionally contradictory results, with differing species-specific responses to the same weather events (García-Mozo et al. 2007; Bisi et al. 2016; Koenig et al. 2016; Bogdziewicz et al. 2019). The differing reactions to weather cues and resulting seed production reported in the literature may in part come from between-species variation in their life history and reproductive cycles (Pérez-Ramos et al. 2015; Bogdziewicz et al. 2019), but may also come from reactions to weather cues changing depending on the climate (Masaki et al. 2008; Poncet et al. 2009; Mooney et al. 2011), or the stage of the reproductive cycle the tree is in when the weather cue occurs (Buechling et al. 2016; Allen et al. 2017). Species-specific studies considering the interaction of the environment at each stage of a masting species reproduction are now required. Due to the complexity of interacting factors, one promising avenue for research is to use Principal component and K-means clustering applied to temporal datasets (as used in Addy et al. 2021). This method takes intra-annual weather patterns and uses them to create distinct yearly categories. This approach may be able to define the weather typologies most likely to result in a masting year. It may generate predictions on how climate change will impact masting and represents our best chance forecasting masting behaviour will change in the future.

Research objective

This research will generate annual weather typologies to be applied to long-term data on acorn production. We will determine if this method of categorisation can be used to i) explain past and predict future masting events, ii) be used to predict how masting will be affected by future anthropogenic climate change and iii) assess if there are continental scale differences within the same species. Other analytical approaches will also be applied.

Research methods***Study system***

Oaks serve as an important umbrella species for biodiversity in the UK. The two UK native oak species, *Quercus robur* L. and *Quercus petraea* (Matt.) Liebl. have been recorded to support 2300 species of birds, bryophytes, fungi, invertebrates, lichen and mammals (Mitchell et al. 2019). Other ecosystem services that oak forests provide include, climate regulation, biomass production, water supply, purification and flood defence (Bauhus et al. 2010; Brockerhoff et al. 2013; Thompson

et al. 2014; Sing et al. 2015). UK oaks will mast on average around every 4-7 years, requiring long term data sets to be able to appropriately study their reproduction.

Procurement of acorn crop data

Some acorn production data has already been acquired on the regional and population scale from Forestry England, UK. We have permission to access the records of a UK based seed producer (Forestart, Shropshire), this shall enable us to clarify if low numbers of acorns recorded in Forestry England's data are a result of poor acorn crop and not lack of collection effort. The ICP Forests data will be vital to ensure suitable numbers of independent UK replicates, as well as granting between-country comparison.

Procurement of Environmental data:

In addition to the meteorological data offered from the ICP Forests database, long-term weather station data from the UK Meteorological Office shall be obtained from the most applicable weather stations for each set of acorn production data. If further data is needed for sites outside the UK, then we can obtain this from the country specific meteorological organisation's long-term databases.

Changes in canopy cover have been shown to give some level of predictive power for masting events (Camarero et al. 2010), and should be considered in parallel to weather variables when attempting to predict mast events. The Normalized Difference Vegetation Index will be obtained from ESA's open-source Sentinel-2 or LANDSAT database. This can then be paired to the location of the acorn production data. NASA's open-source data also includes measures of global terrestrial evapotranspiration and leaf area index (LAI). Further data on soil and woodland characteristics shall be obtained from online sources (e.g., soilscape).

Statistical analysis

The study shall use Principal component and K-means clustering (as used in Addy et al. 2021) applied to temporal datasets of weather patterns and acorn production. The analysis shall also include remote sensing data of canopy growth as well as consideration to other abiotic factors such as forest age, forest health and soil condition etc. Principal component analysis is an exploratory analysis used to define the most important sources of variation within complex systems (Wold et al. 1987). To appropriately group the results from the Principal Component Analysis into annual categories we shall use a k-means clustering procedure (Hartigan and Wong 1979). Other analytical approaches will also be applied. All such statistical analyses shall be performed using R v 3.6.1 (R Core Team 2019).

Timescale

The project shall begin in Summer 2021, with model building and analysis taking place over Winter 2021/22. The project shall conclude at the latest March 2024 where I shall have completed my PhD project.

Expected outcomes

The outcome of our study will enable prediction of masting events, enabling more efficient use of resources to collect acorns for conservation or seed orchards. Further understanding of the mechanistic drivers behind oak masting will improve the predictive power as to how climate change could shape UK and EU oak forests, and hint at best practices or management approaches to adopt to limit the potential damage of climate change on oak health.

References

Addy J, Ellis R, Macdonald A, et al (2021) Changes in agricultural climate in South-Eastern England from 1892 to 2016 identified by analysis of weather data and inter-annual variation in cereal crop biomass off-takes and forage yields from permanent pasture. Submitted to Agricultural and Forest Meteorology

Allen RB, Millard P, Richardson SJ (2017) A Resource Centric View of Climate and Mast Seeding in Trees. In: Cánovas FM, Lüttge U, Matyssek R (eds) *Progress in Botany* Vol. 79. Springer International Publishing, Cham, pp 233–268

Bauhus J, van der Meer P, Kanninen M (2010) *Ecosystem goods and services from plantation forests*, Eds. Routledge

Bisi F, von Hardenberg J, Bertolino S, et al (2016) Current and future conifer seed production in the Alps: testing weather factors as cues behind masting. *Eur J Forest Res* 135:743–754. <https://doi.org/10.1007/s10342-016-0969-4>

Bogdziewicz M, Hacket-Pain A, Ascoli D, Szymkowiak J (2021) Environmental variation drives continental-scale synchrony of European beech reproduction. *Ecology*. <https://doi.org/10.1002/ecy.3384>

Bogdziewicz M, Szymkowiak J, Fernandez-Martinez M, et al (2019) The effects of local climate on the correlation between weather and seed production differ in two species with contrasting masting habit. *Agricultural and Forest Meteorology* 268:109–115. <https://doi.org/10.1016/j.agrformet.2019.01.016>

Bogdziewicz M, Szymkowiak J, Kasprzyk I, et al (2017) Masting in wind-pollinated trees: system-specific roles of weather and pollination dynamics in driving seed production. *Ecology* 98:2615–2625. <https://doi.org/10.1002/ecy.1951>

Brockerhoff EG, Jactel H, Parrotta JA, Ferraz SFB (2013) Role of eucalypt and other planted forests in biodiversity conservation and the provision of biodiversity-related ecosystem services. *Forest Ecology and Management* 301:43–50. <https://doi.org/10.1016/j.foreco.2012.09.018>

Buechling A, Martin PH, Canham CD, et al (2016) Climate drivers of seed production in *Picea engelmannii* and response to warming temperatures in the southern Rocky Mountains. *J Ecol* 104:1051–1062. <https://doi.org/10.1111/1365-2745.12572>

Camarero JJ, Albuixech J, López-Lozano R, et al (2010) An increase in canopy cover leads to masting in *Quercus ilex*. *Trees* 24:909–918. <https://doi.org/10.1007/s00468-010-0462-5>

García-Mozo H, Gómez-Casero MT, Domínguez E, Galán C (2007) Influence of pollen emission and weather-related factors on variations in holm-oak (*Quercus ilex* subsp. *ballota*) acorn production. *Environmental and Experimental Botany* 61:35–40. <https://doi.org/10.1016/j.envexpbot.2007.02.009>

Hartigan JA, Wong MA (1979) Algorithm AS 136: A K-Means Clustering Algorithm. *Applied Statistics* 28:100. <https://doi.org/10.2307/2346830>

Koenig WD, Alejano R, Carbonero MD, et al (2016) Is the relationship between mast-seeding and weather in oaks related to their life-history or phylogeny? *Ecology* 97:2603–2615. <https://doi.org/10.1002/ecy.1490>

Masaki T, Oka T, Osumi K, Suzuki W (2008) Geographical variation in climatic cues for mast seeding of *Fagus crenata*. *Popul Ecol* 50:357–366. <https://doi.org/10.1007/s10144-008-0104-6>

Mitchell RJ, Bellamy PE, Ellis CJ, et al (2019) OakEcol: A database of Oak-associated biodiversity within the UK. *Data in Brief* 25:104120. <https://doi.org/10.1016/j.dib.2019.104120>

Mooney KA, Linhart YB, Snyder MA (2011) Masting in ponderosa pine: comparisons of pollen and seed over space and time. *Oecologia* 165:651–661. <https://doi.org/10.1007/s00442-010-1742-x>

Norton DA, Kelly D (1988) Mast Seeding Over 33 Years by *Dacrydium cupressinum* Lamb. (rimu) (Podocarpaceae) in New Zealand: The Importance of Economies of Scale. *Functional Ecology* 2:399–408. <https://doi.org/10.2307/2389413>

Pérez-Ramos IM, Padilla-Díaz CM, Koenig WD, Marañón T (2015) Environmental drivers of mast-seeding in Mediterranean oak species: does leaf habit matter? *J Ecol* 103:691–700. <https://doi.org/10.1111/1365-2745.12400>

Poncet BN, Garat P, Manel S, et al (2009) The effect of climate on masting in the European larch and on its specific seed predators. *Oecologia* 159:527–537. <https://doi.org/10.1007/s00442-008-1233-5>

R Core Team (2019) *R: A language and environment for statistical computing*. R Foundation for Statistical Computing. Vienna, Austria

Sing L, Ray D, Watts K (2015) Ecosystem services and forest management. *Forestry Research* 1-10

Thompson ID, Okabe K, Parrotta JA, et al (2014) Biodiversity and ecosystem services: lessons from nature to improve management of planted forests for REDD-plus. *Biodivers Conserv* 23:2613–2635. <https://doi.org/10.1007/s10531-014-0736-0>



Wold S, Esbensen K, Geladi P (1987) Principal Component Analysis. Chemometrics and Intelligent Laboratory Systems 37–52