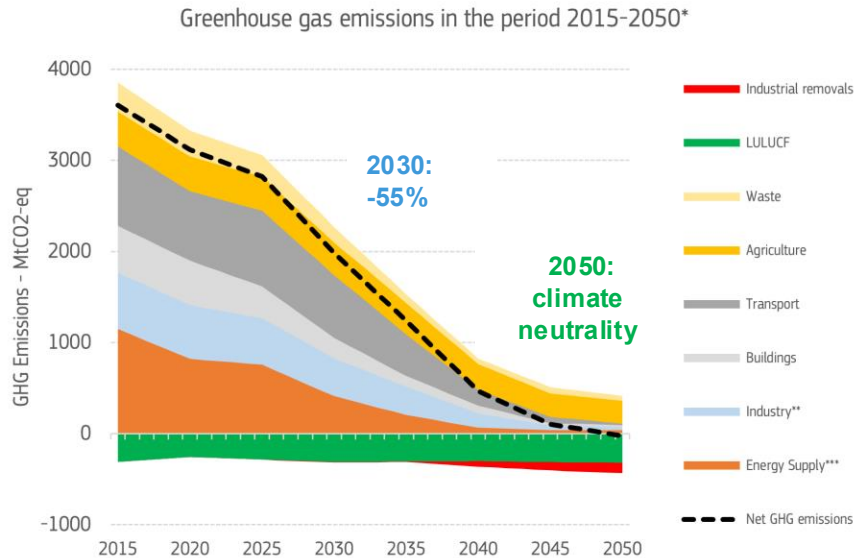


# Supporting EU Climate Goals through Improved Satellite based Forest Monitoring and Modelling: A suggested research roadmap

Mirco Migliavacca, Alessandro Cescatti, Giacomo Grassi, Valerio Avitabile, Mark Pickering, Johannes Breidenbach, Jukka Miettinen, Pathfinder HE partners

# Motivation

The EU Climate law requires a *balance* between anthropogenic GHG emissions and **CO<sub>2</sub> removals** by 2050



The importance of the forest CO<sub>2</sub> sink will increase over time

\*Source: PRIMES, GAINS, GLOBIOM

\*\*Excluding non-BECCS industrial removals

\*\*\*Including Bioenergy with carbon capture and storage (BECCS)

# Motivation

Widespread decline of forest carbon sink in Europe

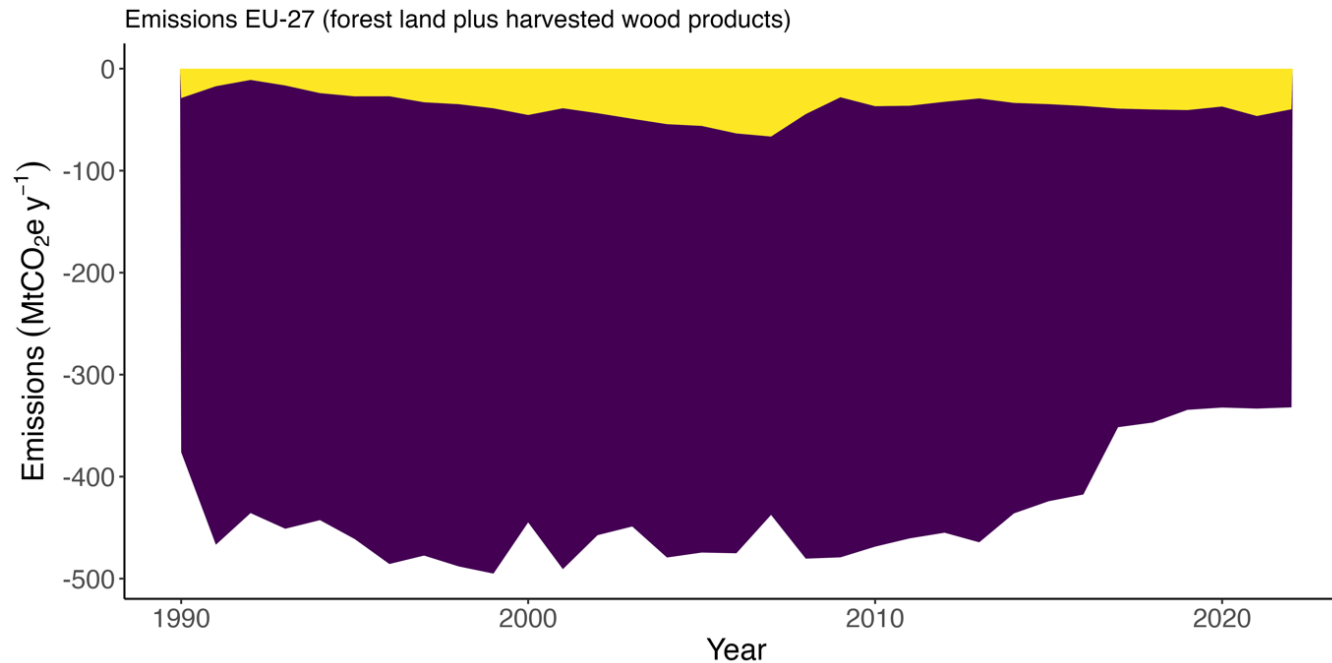


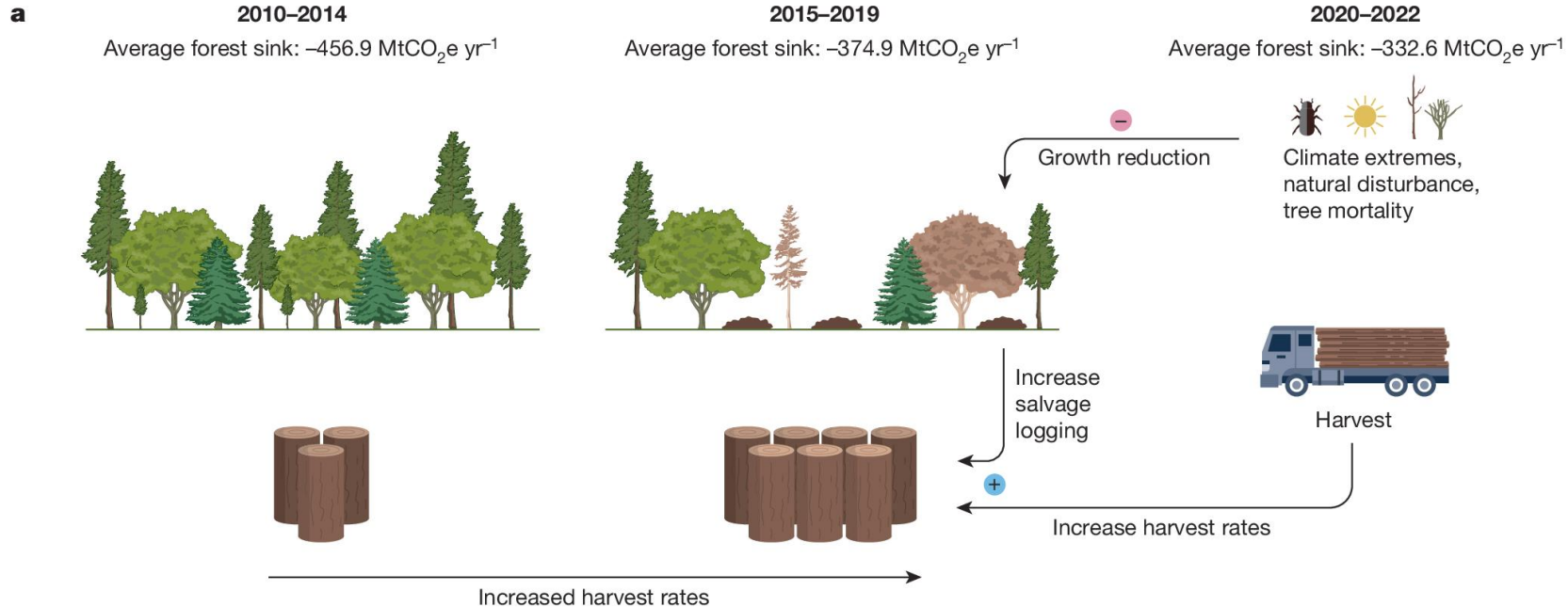
Figure based on  
2024 EEA reporting





How can research support climate policies?

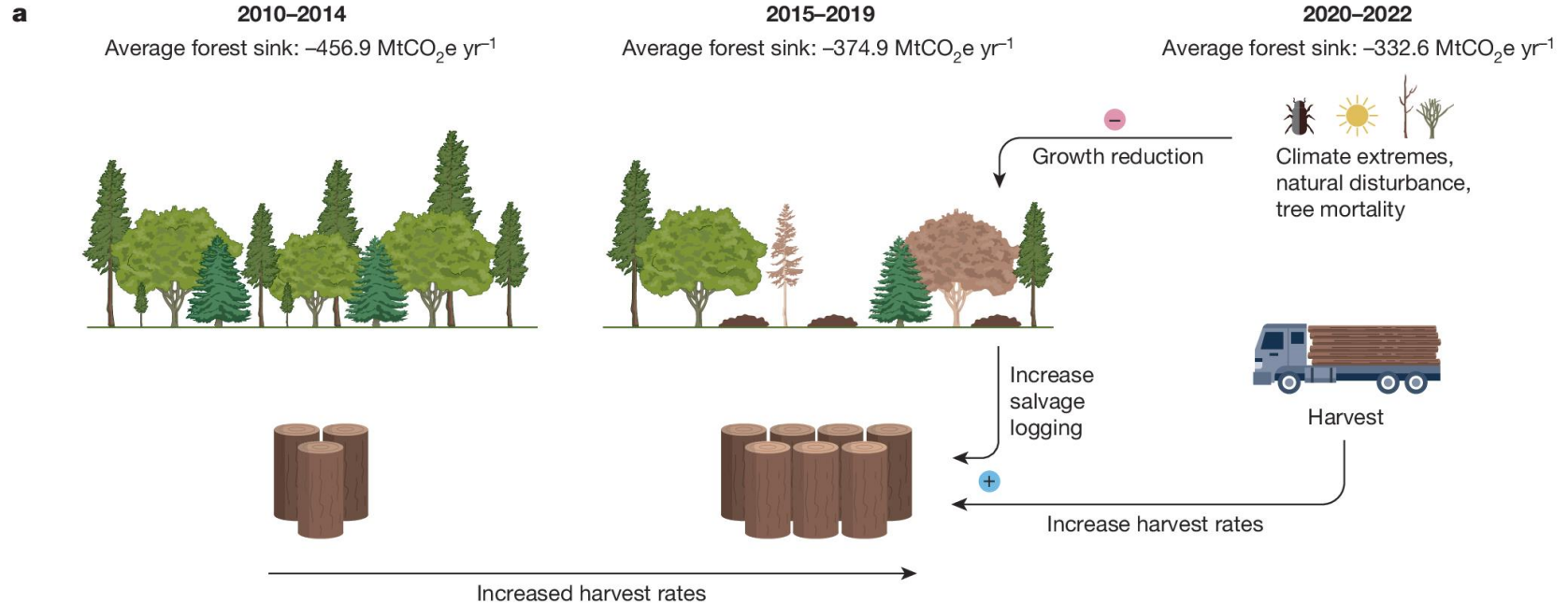
# What are the causes?



[Migliavacca et al., 2025, Nature, 643, 1203–1213](#)

# What are the causes?

How much is the importance of long-lasting vs controllable (mgmt) drivers?



[Migliavacca et al., 2025, Nature, 643, 1203–1213](#)

## Controllable

## Long-lasting



Harvest and  
management

Climate change and  
extreme events

### Solutions

- Biodiversity-oriented afforestation
- Harvest reduction
- Increase rotation length
- Increase stand-age diversity
- Improve deadwood management
- Increase storage in harvested wood products

- Understanding the impact of climate extremes on forests
- Understanding the role of biodiversity as a climate-extreme buffer
- Quantification of climate extremes–harvest feedbacks
- Increasing forest resilience (age diversity and climate-resilient species)
- Assisted tree migration

### Aspects to consider

- Socioeconomic impacts of harvest reduction
- Long-term versus short-term effects of forest management decisions
- Progressive forest ageing and sink saturation
- Effects on soil carbon
- Impacts on water cycle and albedo

- Afforestation impact on water, albedo and biogeochemical cycles
- Long-term success of afforestation
- Assessment of climate-induced species bottleneck

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# Research priorities to support policies

## Research priorities

High-spatial-and-temporal-resolution mapping of forest characteristics

Modelling of present time and future forest carbon sink

Quantifying the importance of long-lasting and controllable drivers of the forest carbon sink decline



Sustainable forest management (tree planting, biodiversity, harvest and deadwood)

Potential trade-offs of nature-based climate solutions



- LULUCF
- ✦ European Climate Law
- Soil Monitoring Directive Proposal
- ◆ Nature Restoration Law
- Biodiversity strategy
- ⬡ Carbon Removals Certification
- ▲ Forest Monitoring Law
- ▶ Forest strategy

Modified from [Migliavacca et al., 2025, Nature, 643, 1203–1213](#)

# Research priorities to support policies

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## Current solution

- New generation of products under development (for example, disturbance atlas, tree height, biomass)



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## Ways forward

- Map key variables for policy support: forest management disturbance type, mortality (**S**)
- Scalable and consistent biodiversity monitoring (**S**)
- Building open datasets of tree mortality and biomass (**S**)
- Adoption of privacy-preserving technologies to train machine-learning models (**S**)
- Adapt the ground data to the needs of Earth observation (**M**)

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**Example mapping forest Net Annual Increment**

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LULUCF



European  
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Soil Monitoring  
Directive Proposal



Nature Restoration Law



Biodiversity strategy



Carbon Removals  
Certification



Forest  
Monitoring Law



Forest strategy

# Research priorities to support policies

## Research priorities

Modelling of present time and future forest carbon sink



Sustainable forest management (tree planting, biodiversity, harvest and deadwood)



- Use of flux tower data and stocks to constrain statistical flux modelling at a scale that is useful for the real-world applications (**S**)
- Hybrid models to improve the description of response of vegetation to droughts, disturbance and fires (**M**)
- Better implementation of forest management in current modelling frameworks (**S**)
- Relevance of taxonomic, structural and functional diversity on resilience (**M**)

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**Importance of structural diversity as adaptation measure**

[Modified from Migliavacca et al., 2025, Nature, 643, 1203–1213](#)



LULUCF



European Climate Law



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Biodiversity strategy



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Forest Monitoring Law



Forest strategy

# Modelling carbon removals

Modelling forest net annual increments (NAI) in support to the Carbon Removals and Carbon Farming (CRCF) combining EO and National Forest Inventory data

# Monitoring forest net annual increment

Collection of co-located NFI and Sentinel 2/Copernicus data

Prediction Net Annual Increments (Machine/Deep learning)

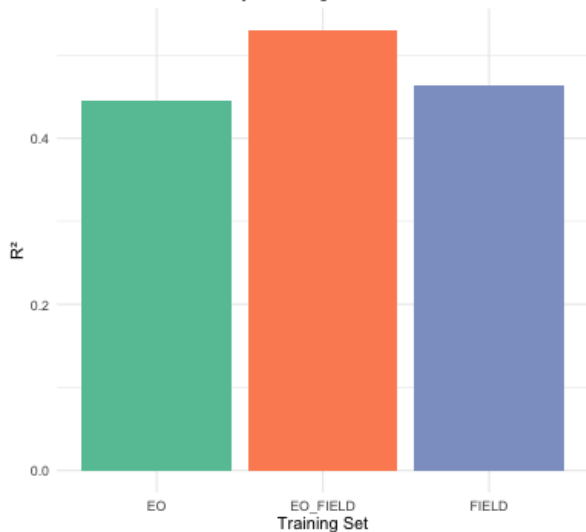
Prediction based on FIELD data and EO only



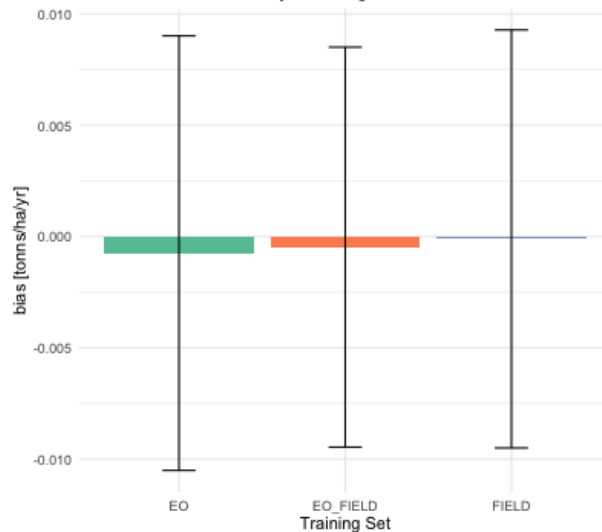
# Monitoring forest net annual increment

Cross-validation Metrics for Different Training Sets

R<sup>2</sup> cross-validation by Training Set



bias cross-validation by Training Set



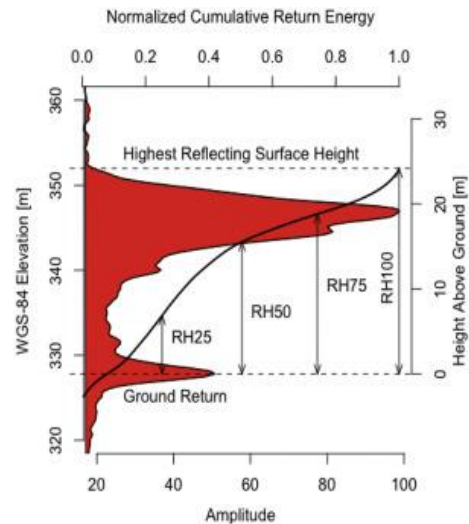
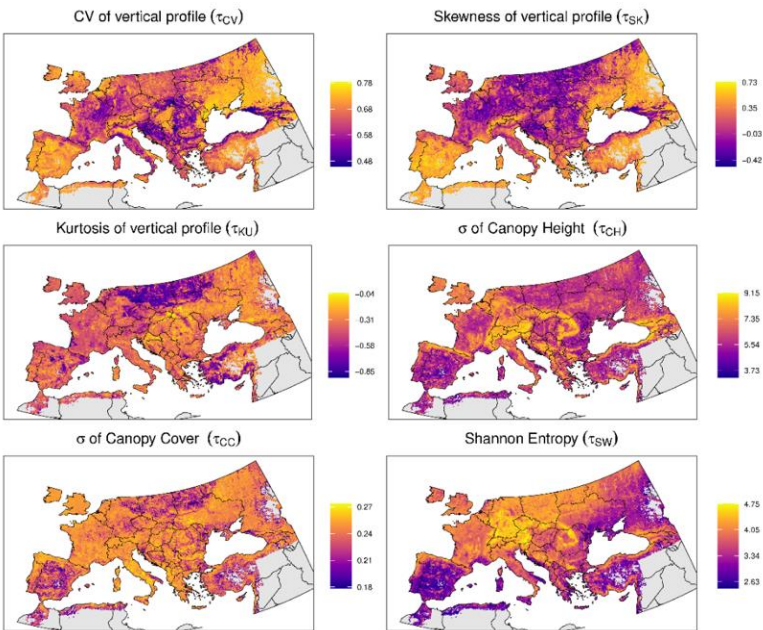
- Accuracy of EO  $\approx$  FIELD for the application at EU-level
- Accuracy of FIELD + EO is the best
- Main predictors: AGB, Tree Cover, Species, Sentinel bands;
- Quantification tool for supporting the CRCF

# Resilience and diversity

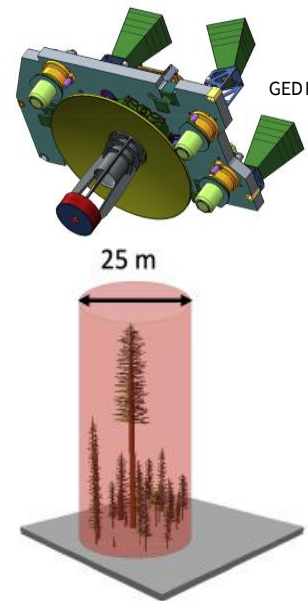
Understanding the relationship between forest resilience and diversity  
(**structural**, **taxonomic** and functional) under climate change

# Forest Structural Diversity (FSD)

- GEDI on ISS (full-waveform LiDAR)
- Relative vertical profiles of canopy elements
- Structural diversity at 5km resolution



Dubayah, R., (2020)

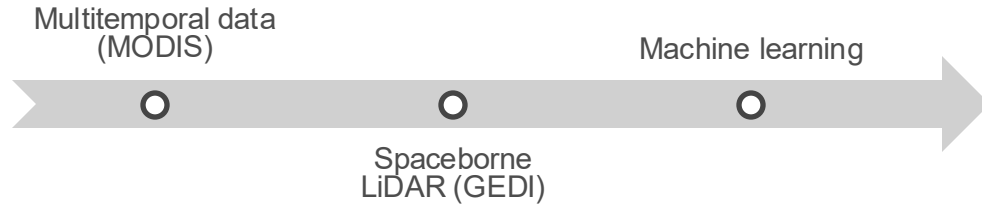


A dataset on the structural diversity of European forests

Marco Girardello ✉, Gonzalo Oton ✉, Matteo Piccardo, Mark Pickering, Agata Ella, Guido Ceccherini, Mariano Garcia, Mirco Miglilavacca, and Alessandro Cescatti

<https://essd.copernicus.org/preprints/essd-2024-471/>

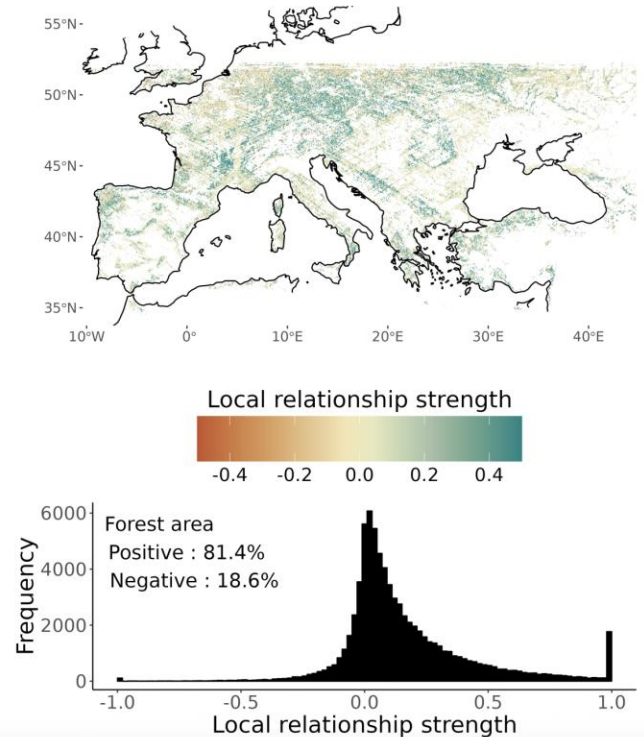
# European forest resilience and diversity



How forest structural diversity shape forest resilience and recovery rates?

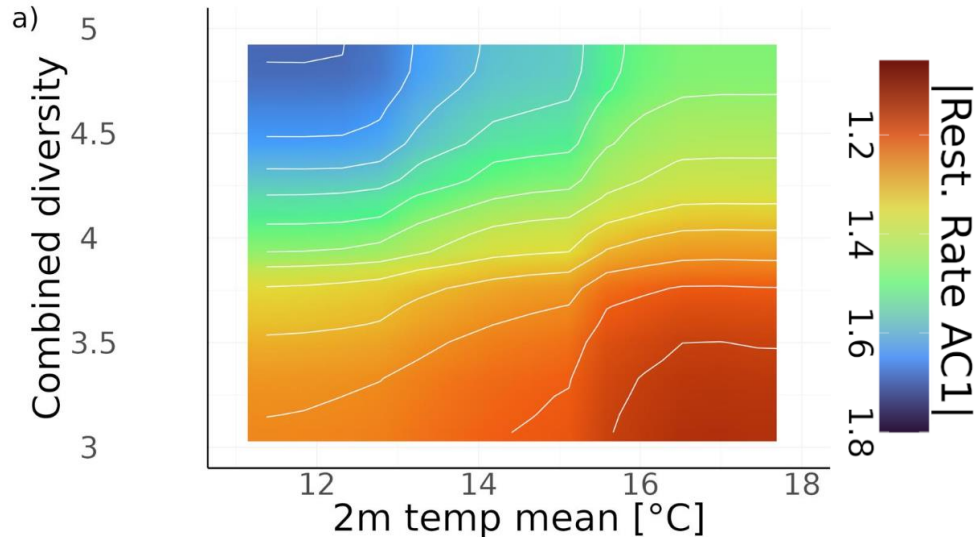
- 80% of EU forests show a **positive relationship** between resilience and structural diversity
- Increase forest resilience via policies that promote **canopy complexity** vs spatial diversity in canopy height.

Pickering et al., Comms Earth and Environment in press



# Structural diversity as adaptation measure

- Isolines of constant resilience in the forest structural diversity – climate space
- As temperature rise, resilience declines, unless FSD also increases
- Compensating 1 °C increase requires 8-14% relative increase in the horizontal and vertical structural diversity





## How can research support climate policies?

**Timeliness** and **EU-wide consistent** spatially resolved information on state of forests, stock changes and carbon removals dynamics

Assessing the relative contribution of the **long-lasting** vs **controllable drivers**

Develop tools to assess **co-benefit and trade offs** (beyond carbon sequestration) of Nature based climate solution and forest management decisions