

# The land use-climate change-biodiversity nexus in European island stakeholders

Aristides (Aris) Moustakas

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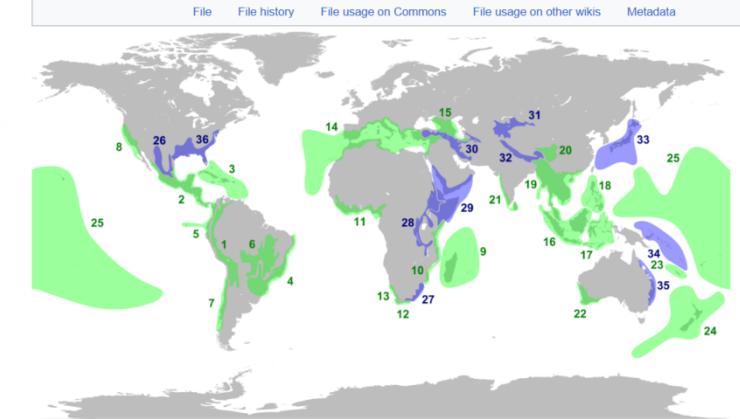
# Overview

- **Global change challenges:** Climate change + land-use change → biodiversity loss & reduced ecosystem services.
- **Islands' importance:**
- Cover a small % of Earth's surface.
- Host  $>\frac{1}{3}$  of global biodiversity.
- Provide critical ecosystem services (water, food, regulation, culture).
- **High vulnerability:**
- Climate impacts (temperature, precipitation, extremes).
- Land-use pressures (tourism, urbanization, renewable energy development).

File:Biodiversity Hotspots.svg

File Discussion

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6.7% Earth's land area



10% human population



20% biodiversity



25% nations



27% languages



50% endangered species 75% recorded extinctions



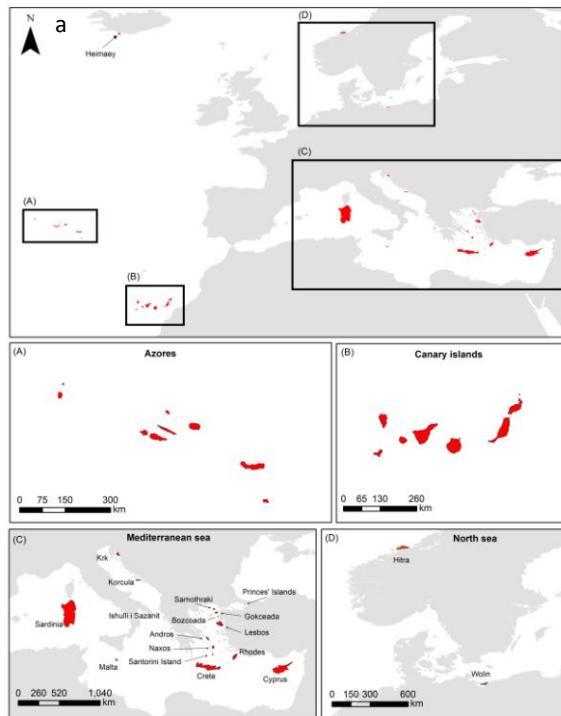
Global Ecology and Conservation

Volume 31, November 2021, e01847

Scientists' warning – The outstanding biodiversity of islands is in peril

# The Land Use – Climate – Biodiversity Nexus

- **Knowledge gap:** Limited understanding of how climate & land-use changes interact on islands.
- **Our study:**
- 21+ European islands/archipelagos.
- Stakeholder-based questionnaire.
- Machine learning to analyze drivers of perception.
- **Research questions:**
- Key climatic & land-use change indicators?
- Impacts on ecosystem services & biodiversity?
- **Combined** relative importance of environmental, social & economic stressors?



# Study Design & Stakeholders

- **737 stakeholders from 21 islands/archipelagos across 12 European countries** (Feb–Apr 2024).
- **Stakeholders:**
  - Permanent island inhabitants OR
  - Individuals with main financial activity on island.
  - Sampling approach: opportunistic: academic researcher on-site or online (Google forms) acted as mediator.
- **Diverse professions covered:**
  - Public authority & policymakers
  - Primary sector (agriculture, fisheries, forestry)
  - Technicians & associated professionals
  - Food industry
  - Financial sector
  - Academics/researchers
  - Tourism professionals
  - Other (students, unemployed, housework, etc.)
- **Questionnaire format:** close-ended, binary (YES/NO) + Likert-type (0–4).
- **Languages:** 12 (including English, Spanish, Italian, Greek, etc.).
- **Distribution methods:**
  - Online forms (42%)
  - Face-to-face interviews (58%)
  - Ecosystem services defined for clarity (with examples: food, water, climate regulation, recreation).

# Survey Methodology

- **Question types:**
- Climate change perceptions (temperature, precipitation, storms, sea level rise, etc.)
- Land-use change perceptions (deforestation, coastal degradation, urban expansion, renewables, etc.)
- Problems (tourism, water issues, invasive species, ecosystem destruction, etc.)
- Holistic societal & economic problems (pollution, financial, policy, population growth, etc.)
- Overall climate change impact on ecosystem services
- Overall climate change impact on ecosystem services

**Table 1.** Variables recorded and their feasible answers or scores

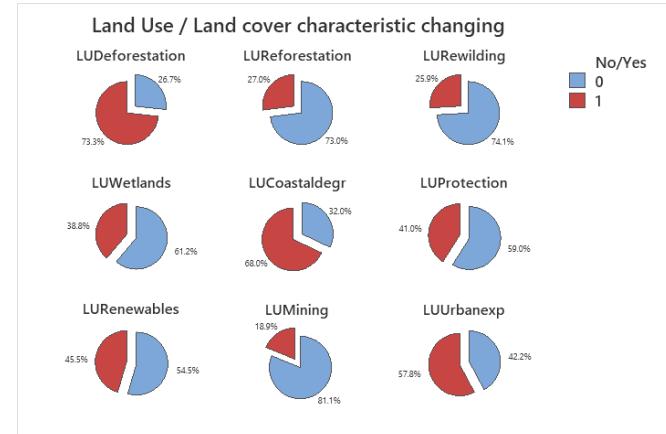
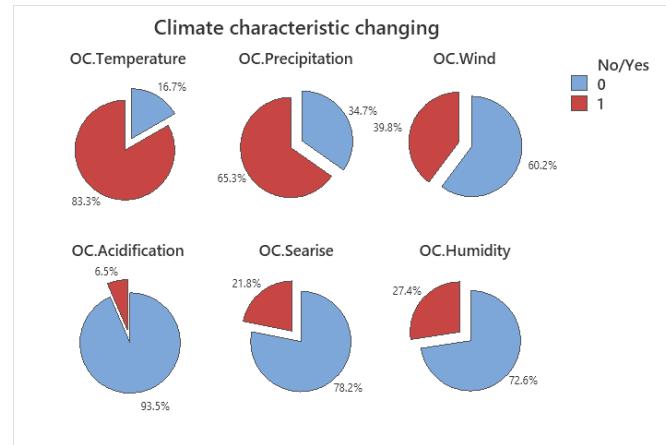
| Category   | Var Nr  | Var Name  | Value   |         |         |          |
|--|---|---|---|---------|---------|----------|
| Question (i) What are the climate characteristics changing in your island?                                     | 1   | Temperature   | Yes/No  |         |         |          |
|  | 2   | Precipitation   | Yes/No  |         |         |          |
|  | 3   | Wind increase/storms                                  | Yes/No  |         |         |          |
|  | 4   | Ocean acidification                                   | Yes/No  |         |         |          |
|  | 5   | Sea level rise  | Yes/No  |         |         |          |
|  | 6   | Humidity increase                                     | Yes/No  |         |         |          |
| Question (ii) What are the observable land use / land cover changes in your island?                            | 7   | Deforestation   | Yes/No  |         |         |          |
|  | 8   | Reforestation   | Yes/No  |         |         |          |
|  | 9   | Rewilding   | Yes/No  |         |         |          |
|  | 10  | Wetland modification                                  | Yes/No  |         |         |          |
|  | 11  | Coastal degradation                                   | Yes/No  |         |         |          |
|  | 12  | Habitat protection                                    | Yes/No  |         |         |          |
|  | 13  | Renewable energy facility issues                      | Yes/No  |         |         |          |
|  | 14  | Mining related issues                                 | Yes/No  |         |         |          |
|  | 15  | Urban expansion related issues                        | Yes/No  |         |         |          |
|  | (iii) Ranking overall problems                  |   | Values ranking the observed effects of problems on the island context, from 0 for Don't Know, 1 for having a small effect, 2 having a moderate effect, 3 having an important, to 4 having a very big/significant effect |         |         |          |
|  | 16  | Climate change  | 0   | 1       | 2       | 3        |
|  | 17  | Land use change                                       | 0   | 1       | 2       | 3        |
|  | 18  | Population growth                                     | 0   | 1       | 2       | 3        |
|  | 19  | Economic growth                                       | 0   | 1       | 2       | 3        |
|  | 20  | Pollution   | 0   | 1       | 2       | 3        |
|  | 21  | Resource extraction                                   | 0   | 1       | 2       | 3        |
|  | 22  | Policy changes  | 0   | 1       | 2       | 3        |
|  | 23  | Nature overexploitation                               | 0   | 1       | 2       | 3        |
|  | 24  | Austerity   | 0   | 1       | 2       | 3        |
| Question (iv) How would you assess the main climate and land use change induced problems in your island? (0-4) | (iv) Climate change & land use change problems. |   | Values ranking the perceived presence of each problem induced by climate change, from 0 for Don't Know, 1: Not so much, 2: Relative change yes 3: Yes, observable change to 4: Yes, very much climate-induced change.   |         |         |          |
|  | 25  | Tourism   | 0   | 1       | 2       | 3        |
|  | 26  | Damages in habitats, protected areas or monuments etc | 0   | 1       | 2       | 3        |
|  | 27  | Primary sector (Agriculture, fisheries etc)           | 0   | 1       | 2       | 3        |
|  | 28  | Ecosystem destruction/Biodiversity loss               | 0   | 1       | 2       | 3        |
| Climate change impact on the benefits of biodiversity.   | 29  | Changes in urban environment                          | 0   | 1       | 2       | 3        |
|  | 30  | New diseases  | 0   | 1       | 2       | 3        |
|  | 31  | Invasive species                                      | 0   | 1       | 2       | 3        |
|  | 32  | Carbon sequestration                                  | 0   | 1       | 2       | 3        |
|  | 33  | Pollination   | 0   | 1       | 2       | 3        |
|  | 34  | Energy related issues                                 | 0   | 1       | 2       | 3        |
|  | 35  | Soil erosion  | 0   | 1       | 2       | 3        |
|  | 36  | Water related issues                                  | 0   | 1       | 2       | 3        |
|  | 37  | Ecosystem recreation                                  | 0   | 1       | 2       | 3        |
|  | 38  | Infrastructure damages                                | 0   | 1       | 2       | 3        |
| Land use change impact on the benefits of biodiversity   | 39  | Climate change impact on ecosystem services           | Negative  | Unclear | Neutral | Positive |
|  | 40  | Land use change impact on ecosystem services          | Negative  | Unclear | Neutral | Positive |

# Analysis Approach

- **Goal:** Identify drivers of perception regarding biodiversity & ecosystem service impacts.
- **Dependent variables:**
- Perceived *climate change* impacts on ecosystem services (scores: negative, unclear, neutral, or positive).
- Perceived *land-use change* impacts on ecosystem services.
- **Explanatory variables (38):**
  - Climate change characteristics (binary)
  - Land-use characteristics (binary)
  - Climate/land-use related problems (ranked)
  - Overall problems (ranked)
- **Method:** Random Forest classifiers (Machine learning).
- Handles complex, high-dimensional, noisy data.
- 70/30 train-test split (validated with sensitivity analysis).
- Variable importance chart → identifies most influential predictors.

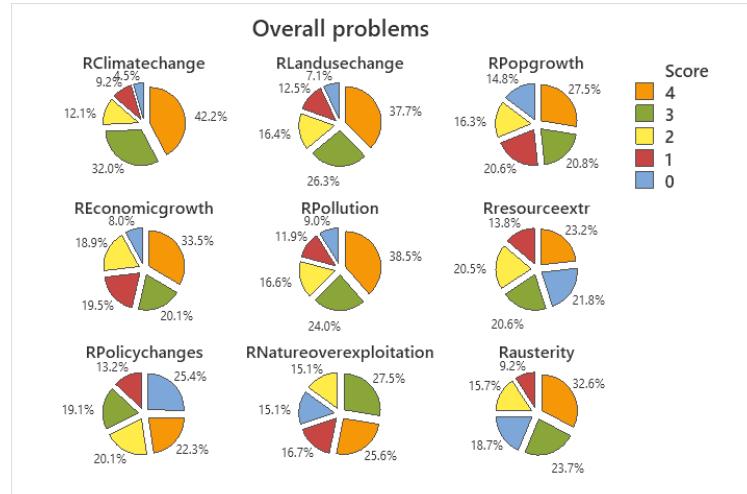
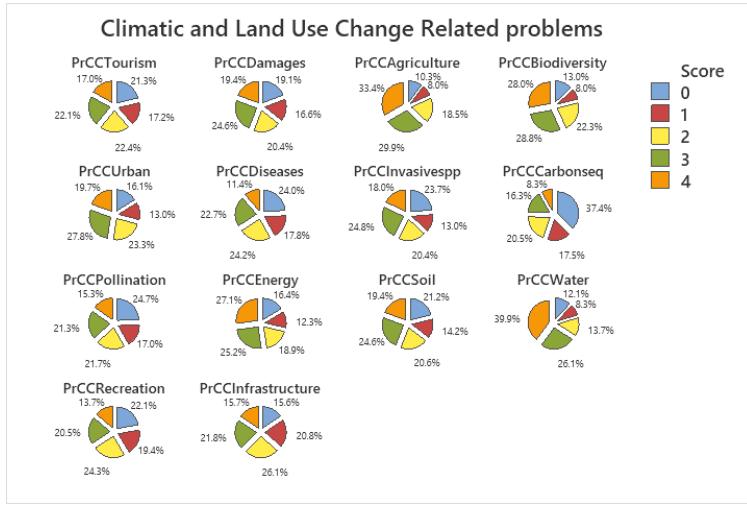
# Climate & Land Use Change Characteristics: perceptions of change

- **Climate change:**
- Most reported: **Temperature**, then precipitation, wind, humidity.
- Least reported: **Sea level rise & acidification**.
- **Land use change:**
- Most reported: **Deforestation**, coastal degradation, urban expansion.
- Renewable energy facilities = 4th.
- Habitat protection = insufficient.
- Rewilding/reforestation also raised concerns.



# Problem Severity Rankings: Perceived Problems on Islands

- **Most severe problems:**
- Water-related issues
- Primary production sector (agriculture, food)
- Biodiversity loss
- Renewable energy facilities
- **Moderate:** Urban expansion, habitat destruction, soil erosion.
- **Lower:** Carbon sequestration, diseases, pollination, recreation.
- **Overall problems:**
  - Highest = Climate change
  - Then = Land-use change + Pollution.
  - Economic growth & austerity = moderate.
  - Lowest = Policy changes.

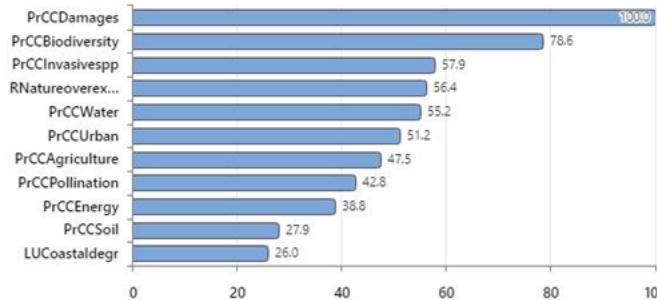


# Climate Change Impacts on Ecosystem Services (ML Results)

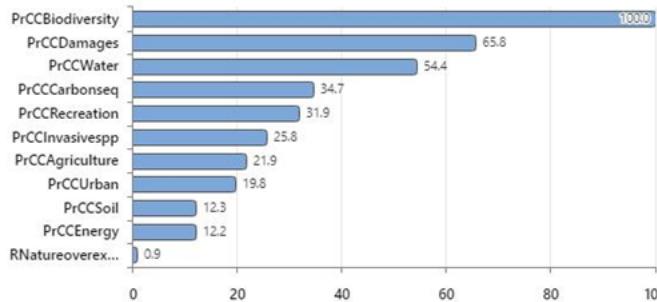
## *What Drives Perceptions of Climate Change Impacts?*

- **(a) Negative impacts (62.8% of stakeholders):**
  - Driven by **habitat destruction, biodiversity loss, invasive species, water issues, overexploitation**.
  - Accuracy: ~67%.
- **(b) Unclear impacts (19.4%):**
  - Linked to **biodiversity loss, water issues, carbon sequestration, recreation, invasive species**.
  - Accuracy: ~62%.
- **(c) Neutral impacts (14.4%):**
  - Connected to **overexploitation, invasive species, carbon sequestration, pollution, policy changes**.
  - Accuracy: ~59%.
- **Positive impacts (3.4%):** Insufficient data.

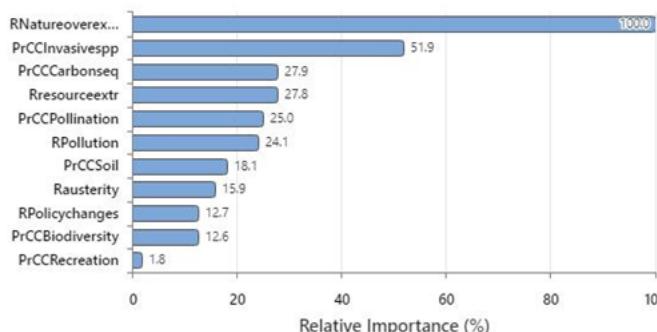
a. Negative Climate Change Impacts



b. Unclear Climate Change Impacts



c. Neutral Climate Change Impacts



# Land Use Change Impacts on Ecosystem Services (ML Results)

## Title: *What Drives Perceptions of Land Use Change Impacts?*

- **(a) Negative impacts (54.4% of stakeholders):**

- Driven by **coastal degradation, biodiversity loss, pollution, infrastructure damage, invasive species.**

- Accuracy: ~63%.

- **(b) Unclear impacts (21.4%):**

- Linked to **rewilding, urban expansion, austerity, recreation, policy changes, wetlands.**

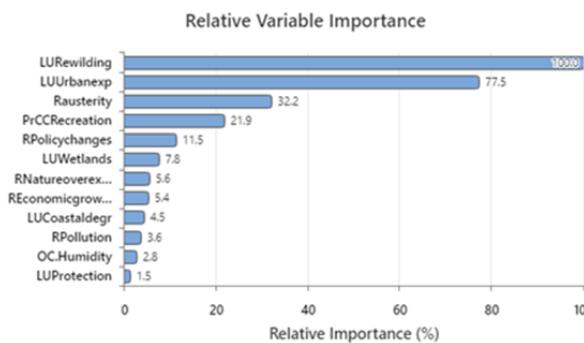
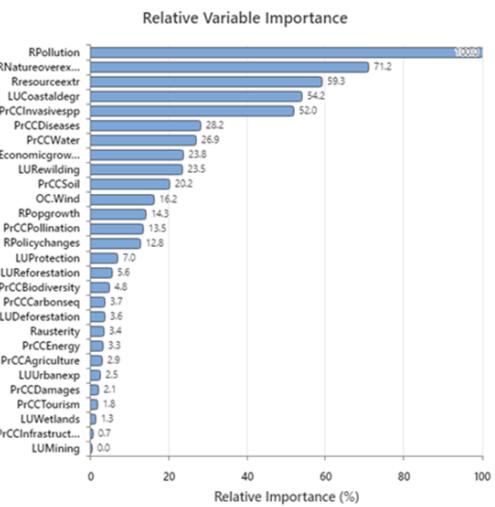
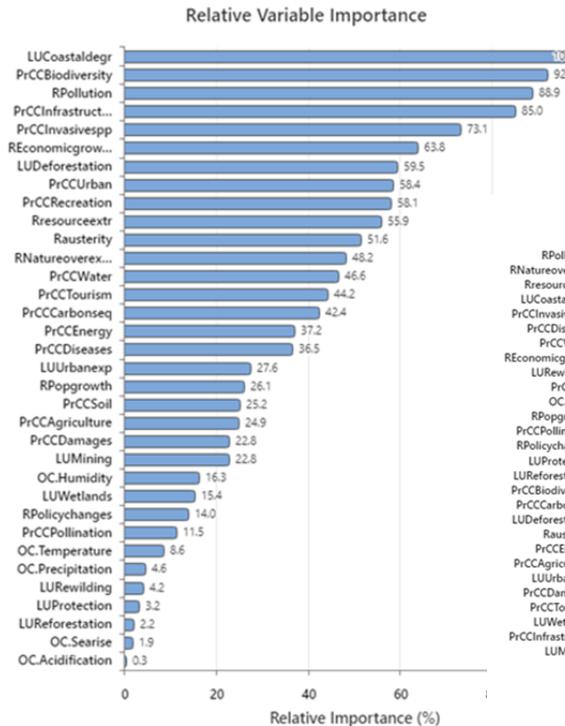
- Accuracy: ~69%.

- **(c) Neutral impacts (21.4%):**

- Associated with **pollution, overexploitation, resource extraction, coastal degradation, invasive species, disease.**

- Accuracy: ~72%.

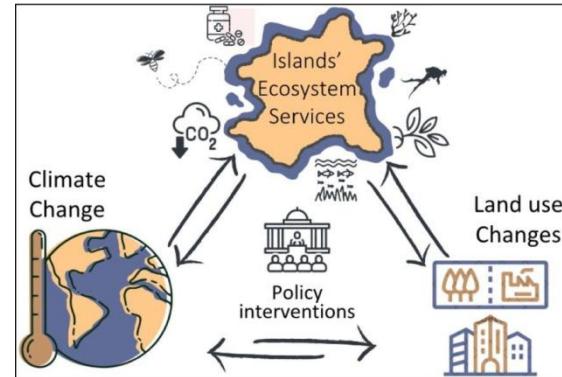
- **Positive impacts (2.7%):** Too few responses to model.



b

# Key Findings & Stakeholder Perceptions: Take-Home Messages from Stakeholders

- **Climate change concerns:** Temperature > Precipitation > Sea level rise/acidification.
- **Land use concerns:** Deforestation > Coastal degradation > Urban expansion.
- **Top priority problems:** Water scarcity/management, energy concerns (supply & renewables), biodiversity loss.
- **Perceived impacts:**
- Climate change → mostly negative impacts on ecosystem services (biodiversity loss & habitat destruction).
- Land use change → also negative but influenced by more diverse factors.
- **Consistency across islands:** Stakeholders can differentiate climate vs land-use impacts, suggesting targeted & integrated management is needed.



# Climate & Land Use Drivers: *Drivers of Negative Impacts*

- **Climate:** Temperature changes, habitat destruction, biodiversity loss, water issues.
- **Land use:** Coastal degradation, biodiversity loss, pollution, infrastructure damage, renewable energy facilities.
- **Water issues:** Highly perceived by stakeholders but not top predictor in ML analysis → may reflect management issues more than climate-driven changes.
- **Temperature:** Strongly perceived as the main climate driver, aligning with other European and global studies.



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# Energy & Policy Implications: Energy, Renewable Infrastructure & Policy Gaps

- **Energy concerns:**
- Wind & solar facilities → land take, habitat fragmentation, biodiversity loss.
- Renewable initiatives (e.g., EU “Renewable Islands 2030”) often lack local consultation.
- **Policy perception:**
- Not ranked highly by stakeholders → may reflect low awareness or perceived ineffectiveness.
- **Management need:** Integrated solutions combining **biodiversity conservation, energy planning, and stakeholder engagement.**

The European Commission's 'Clean energy for EU islands' page. The page features a banner with a sunset over a coastal town and a green graphic. It includes a sidebar with links to the Clean energy for EU islands initiative, secretariat, forum, and related links. The main content discusses the challenges faced by EU islands in generating sustainable energy.

The Breakthrough Institute's article 'Rethinking Island Energy Transitions' discusses the challenges of transitioning island economies away from fossil fuels. It features a large image of a solar panel array and wind turbines on a small island.

A Google search results page for 'biodiversity strategy eu islands'. The search bar shows the query. The results include a link to the European Union's Biodiversity strategy for 2030. A red circle highlights the search term 'islands' in the results list.

# Limitations & Future Directions: Looking Ahead

- **Factors affecting perceptions:**
- Island size, location, ecosystem type (marine vs terrestrial), stakeholder profession & socioeconomic status.
- **Future research:**
- Map perceptions geographically to understand variation.
- Explore policy efficacy & communication gaps.
- **Are climate change perceptions predictable?**
  
- **Conclusion:**
- Climate and land use change negatively affect ecosystem services; water, energy, and biodiversity are key concerns.
- Stakeholder perceptions should guide **island-specific European policies** for effective management.

## Briefing

January 2016



Islands of the EU: Taking account of their specific needs in EU policy

SUMMARY



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Islands and insularity

POSTED ON FEBRUARY 13, 2022 BY ESPON IN ESPON BLOG



## WG3: Climatic changes, land use changes, and ecosystem services

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Science of The Total Environment

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## Climate land use and other drivers' impacts on island ecosystem services: A global review

Aristides Moustakas <sup>a</sup>   , Shiri Zemah-Shamir <sup>b</sup> , Mirela Tase <sup>c</sup> , Savvas Zotos <sup>d</sup> , Nazli Demirel <sup>e</sup> , Christos Zoumides <sup>f</sup> , Irene Christoforidi <sup>g</sup> , Turgay Dindaroglu <sup>h</sup> , Tamer Albayrak <sup>i,j</sup> , Cigdem Kaptan Ayhan <sup>k</sup> , Mauro Fois <sup>l</sup> , Paraskevi Manolaki <sup>d</sup> , Attila D. Sandor <sup>m,n</sup> , Ina Sieber <sup>o</sup> , Valentini Stamatiadou <sup>p</sup> , Elli Tzirkalli <sup>d</sup> , Ioannis N. Vogiatzakis <sup>d,q</sup> , Ziv Zemah-Shamir <sup>r</sup> , George Zittis <sup>s</sup>  

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