

# Climate change, fisheries, management and modelling approaches

Dawit Yemane

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## 2 Approaches

## 3 Results

## 4 Summary

## 5 Modelling the effects of climate change

# Background

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- Background natural environmental variability (and natural extreme events)
- Long-term directional change in the environment (either the result of long-term natural cycles or man-made e.g. climate change or both)
- Direct and indirect effects of extraction activities (capture fishery on variety of species using different types of gears)

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- In addition the effects of the above operate/manifest at different spatial and temporal windows
- All of which making the whole problem of correctly/appropriately attributing observed response to the different drivers rather a difficult task.

# Approaches

# Analysis of literature on climate change and fisheries

A quantitative analysis of scientific publications on climate change, its impact and proposed adaptations

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- Classify the text from all the document into distinct themes (topics). Done using Topic modelling
- Latent Dirichtlet Allocation (LDA) model, commonly used, applied based to classifiy the documents into topics.

## Data and methods

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- Analysis of policy and research document on climate change from three developed countries: Australia, Canada, and USA

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- Similarly FAO technical report for 2008, 2009, and 2016 were processed.

# Results

# Summary of research on climate change in relation to fisheries

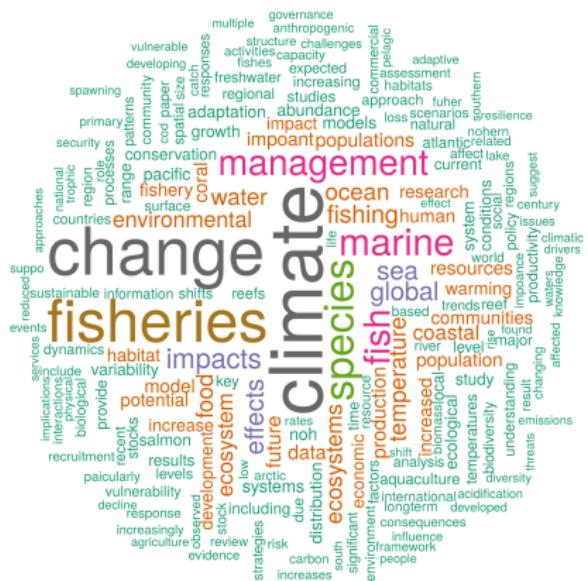


Figure 1: Most common terms global research on climate change and

## Time series of topics/themes covered in the research on climate change and fisheries (all years)

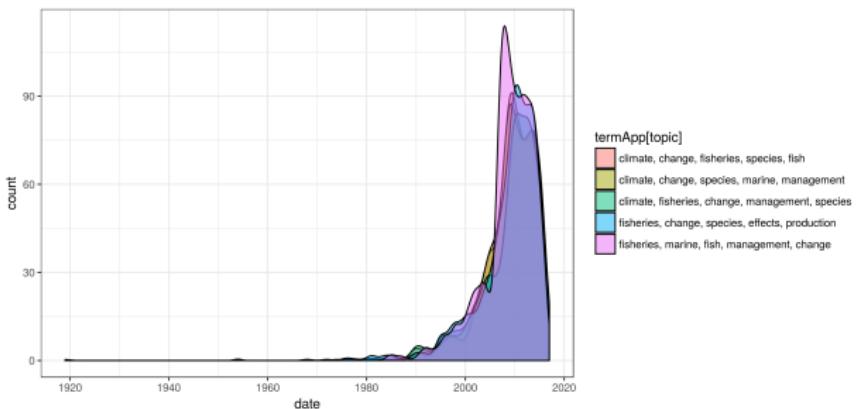


Figure 2: Classification of the abstracts into five topics all years

## Time series of topics/themes covered in the research on climate change and fisheries (latest years)

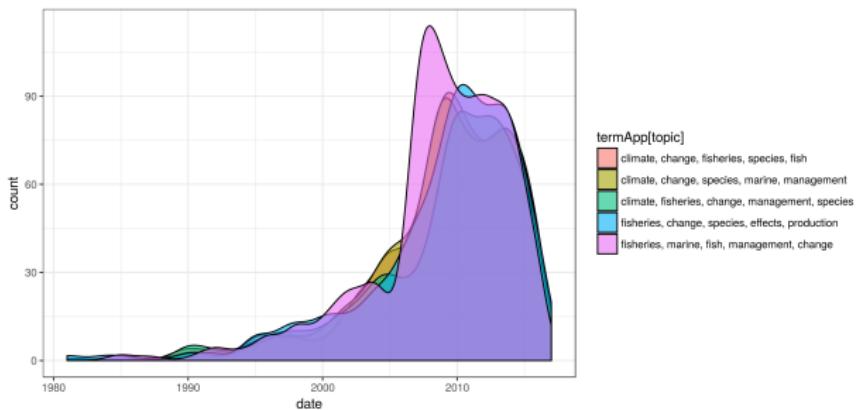


Figure 3: Classification of the abstracts into five topics since 1980

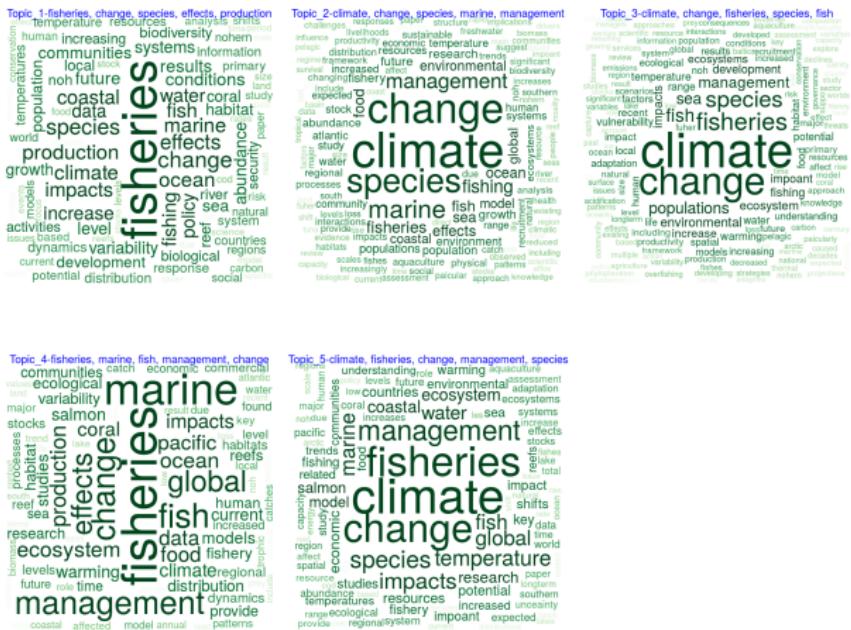


Figure 4: Sets of words characterizing the five topics

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- Topic 5: Climate change (e.g. change in temperature) and fisheries management

## Network of author-coauthors: Most important authors in the climate change-fisheries research

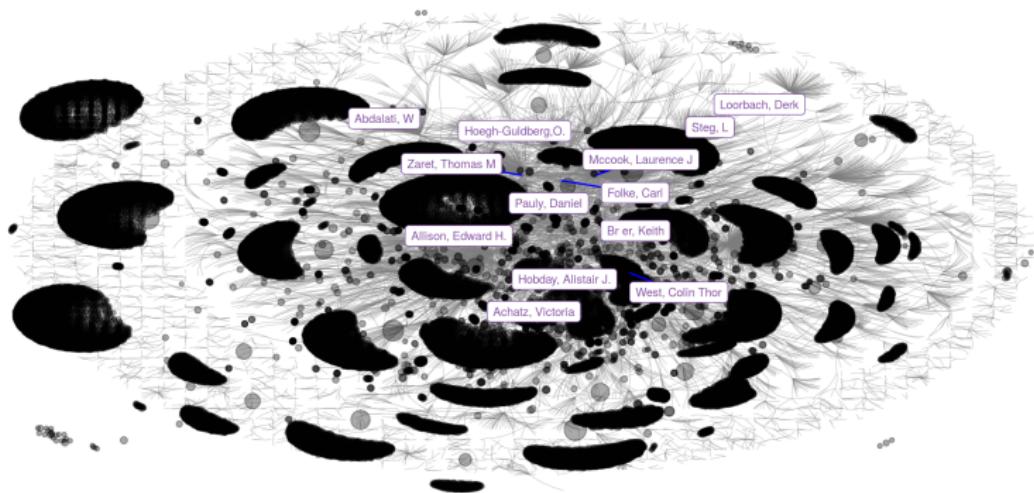


Figure 5: Most important authors in the research on climate change and fisheries

Synthesizing policy and research document from FAO for three years  
2008, 2009 and 2016

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Figure 6: Comparison of words that are unique to the FAO technical report from 2008, 2009, 2016

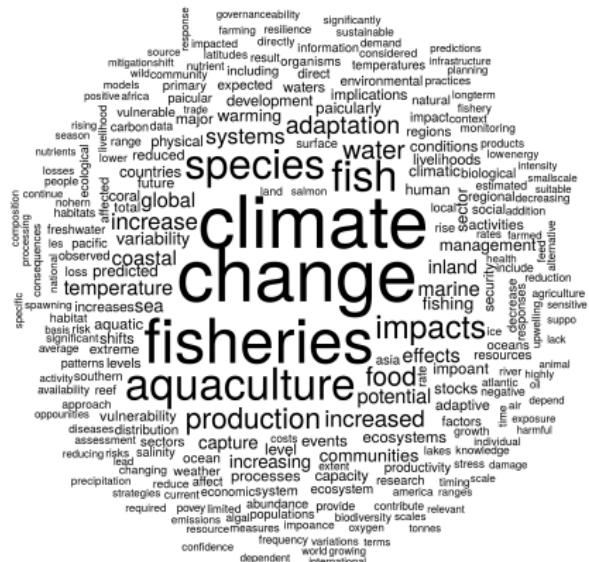


Figure 7: Comparison of words that are common to all FAO technical report from 2008, 2009, 2016

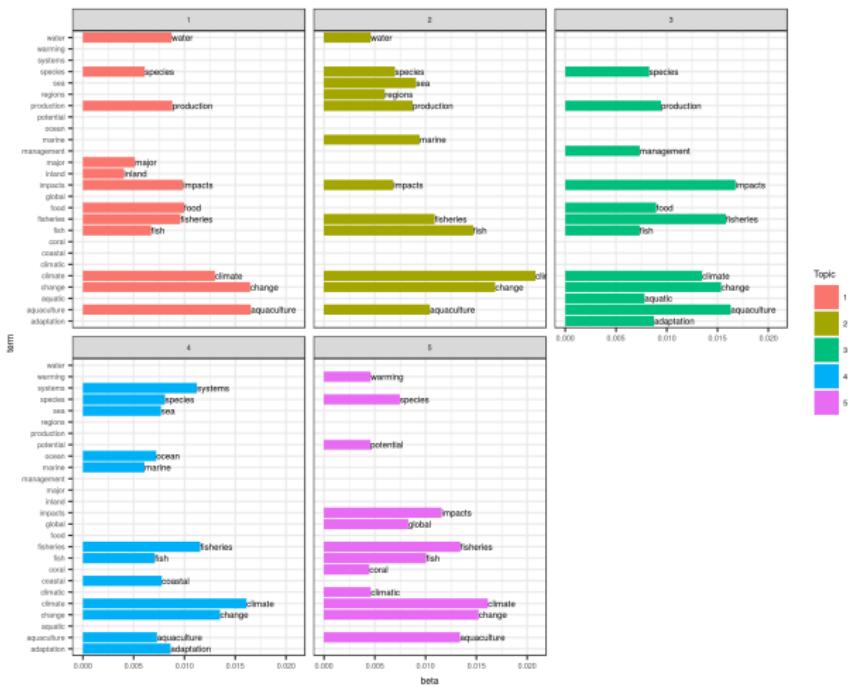


Figure 8: Classification of the three FAO technical reports into five topics and terms characterizing each topic

## Approximate interpretation of the five topics

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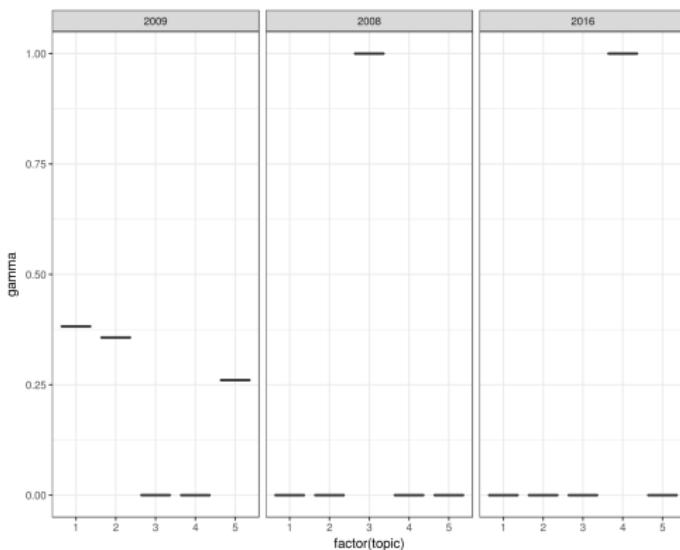


Figure 9:

Synthesizing policy and research document from Canada, USA, and Australia

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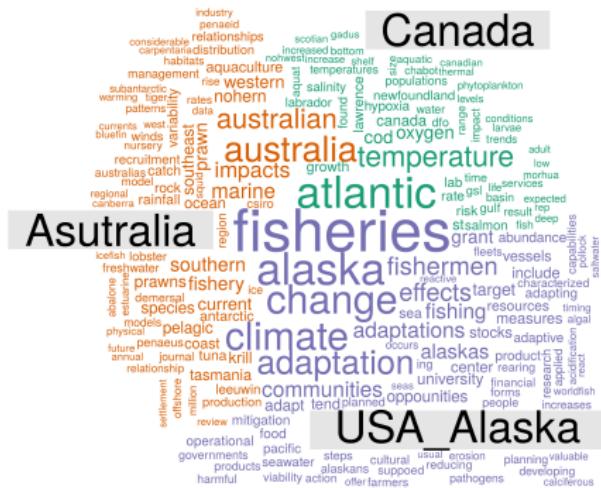


Figure 10: Comparison of words that are unique to the policy and research document from the three countries

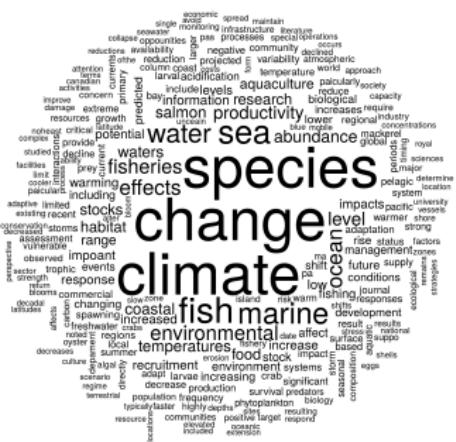


Figure 11: Comparison of words that are common to all the three policy document from Canada, USA and Australia

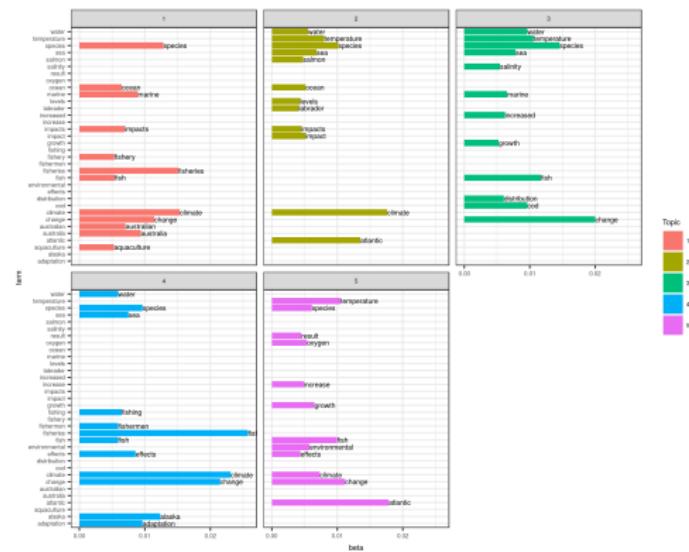


Figure 12: Classification of the policy and research documents from the three countries into five topics and terms characterizing each topic

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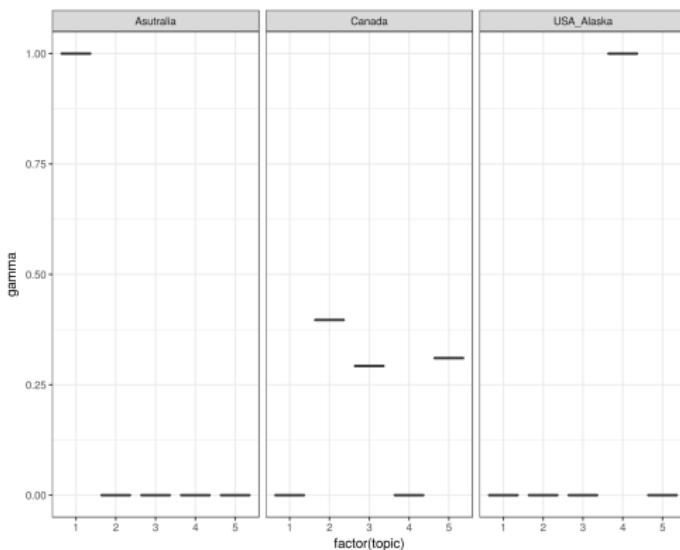


Figure 13:



# Summary

# Common themes in all document on climate change and fisheries

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## Modelling the effects of climate change

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- Coupled biogeochemical-hydrodynamic models (sometimes also linked to individual based models)

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- Incorporate the environmental variables, extracted from climate models under a given scenario, into the population projection model for fish and shell fish
- Evaluation of the mean, variance and trend in the production of fish and shell fish under a changing ecosystem