

A photograph of a school of cod fish swimming in dark water. The fish are silvery with a mottled pattern on their sides. The background is dark and slightly out of focus, showing other fish in the school.

**Unquantifiable uncertainty in  
projecting stock response to  
climate change: Example from NEA  
cod**

*Daniel Howell (IMR, Norway), Anatoly Filin  
(PINRO, Russia), Bjarte Bogstad, Jan Erik  
Stiansen and Elena Eriksen (IMR, Norway)*

The image shows a school of fish in a dark, underwater environment. In the foreground, a large cod-like fish with a mottled pattern and a prominent white lateral line is swimming towards the right. Behind it, several other fish are visible, including a larger, smoother fish in the upper right and a smaller fish in the upper left. The background is dark and indistinct.

OR

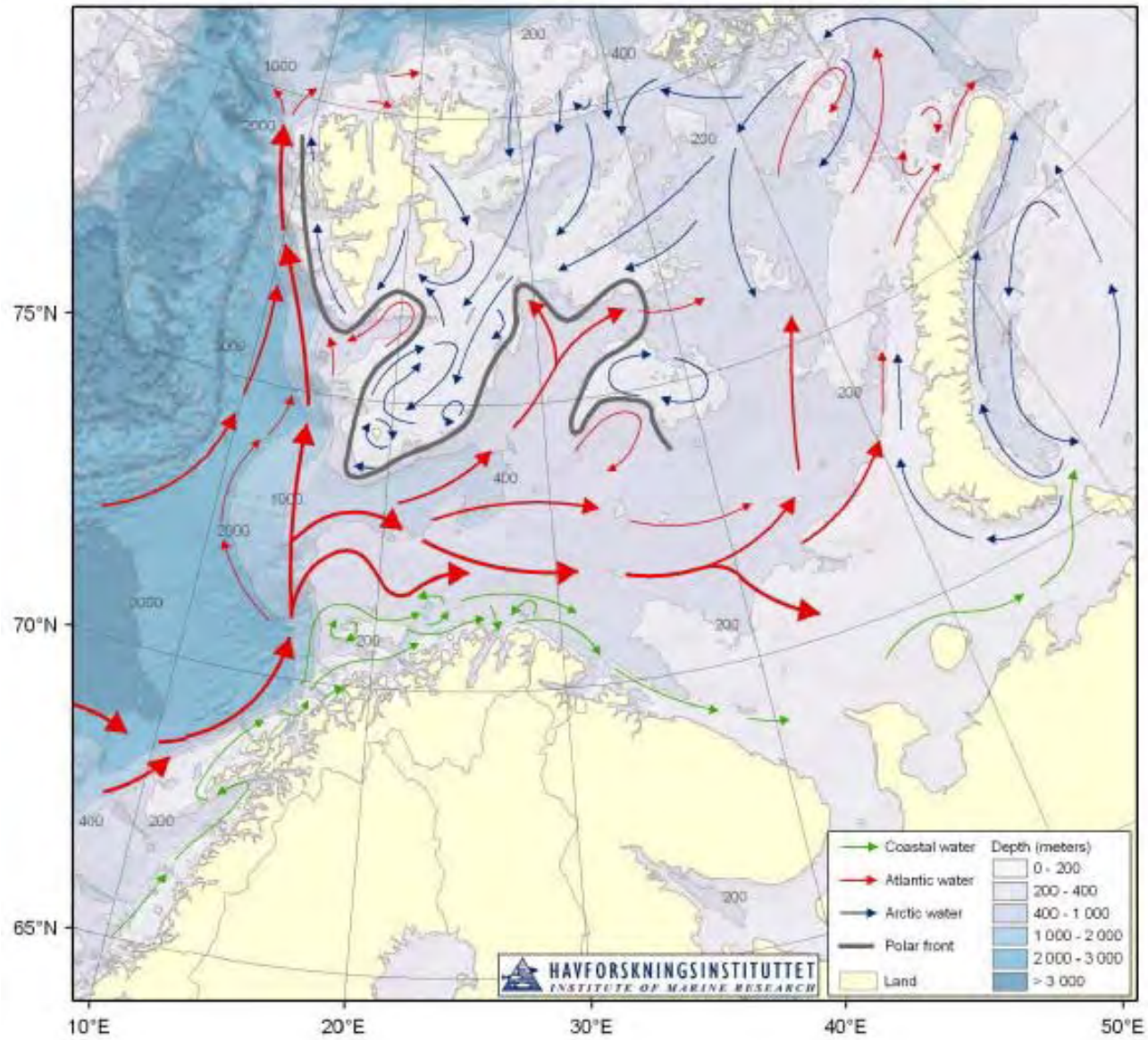
**“No, we can’t”**

*Daniel Howell (IMR, Norway), Anatoly Filin (PINRO, Russia), Bjarte Bogstad, Jan Erik Stiansen and Elena Eriksen (IMR, Norway)*

# Aim

- Funding agencies in Europe are increasingly asking for uncertainty estimates for multispecies/ecosystem projections
- There are many (many, many) sources of uncertainty in modelling ecosystem responses
- Focus on just one single source
  - Real world example, with good historical data
- Questions are:
  - Does this one source matter?
  - Can we (ever) quantify the uncertainty?

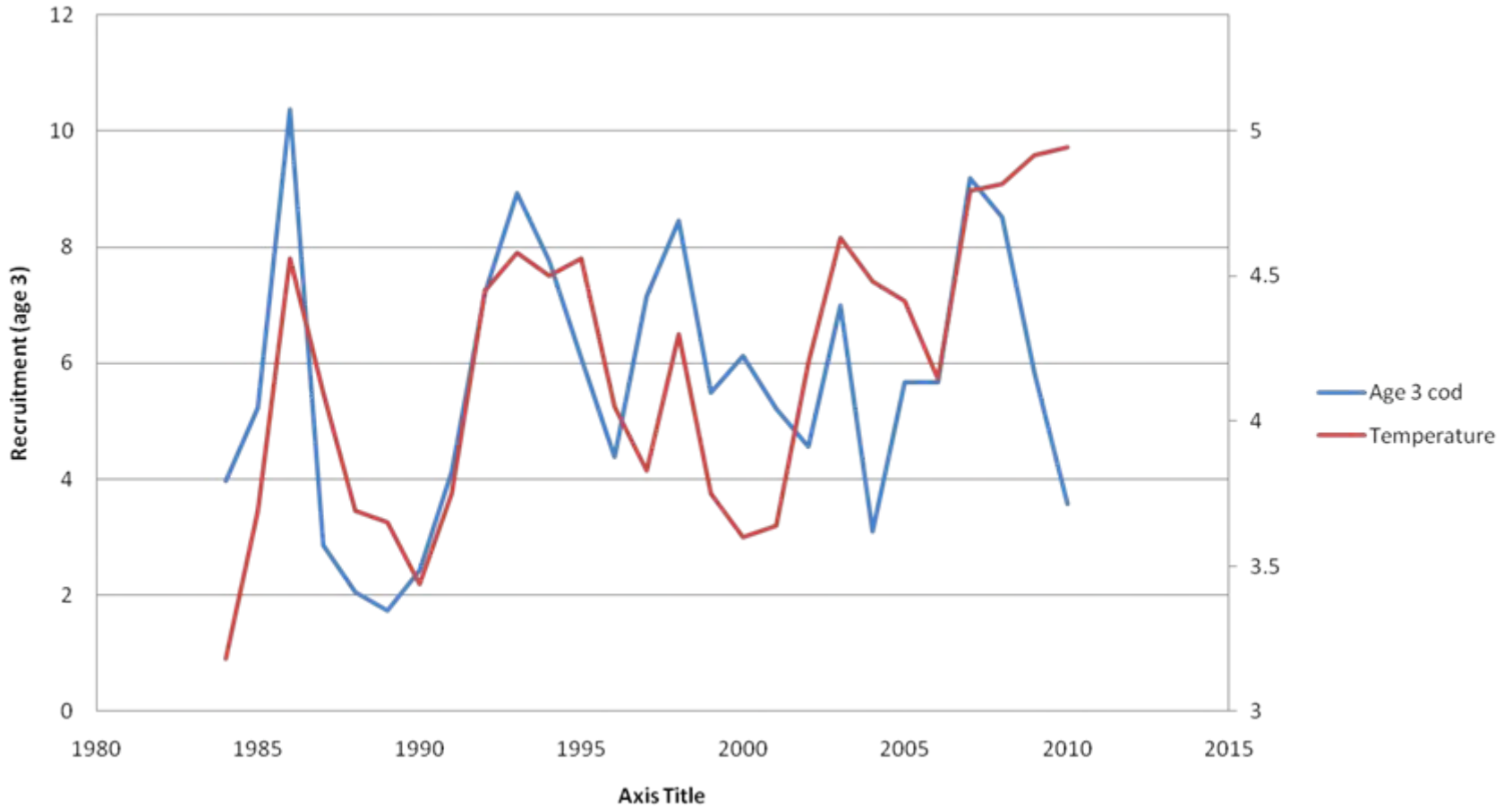
# Barents Sea



# Age 3 cod, Kola Section temperature in year of spawning



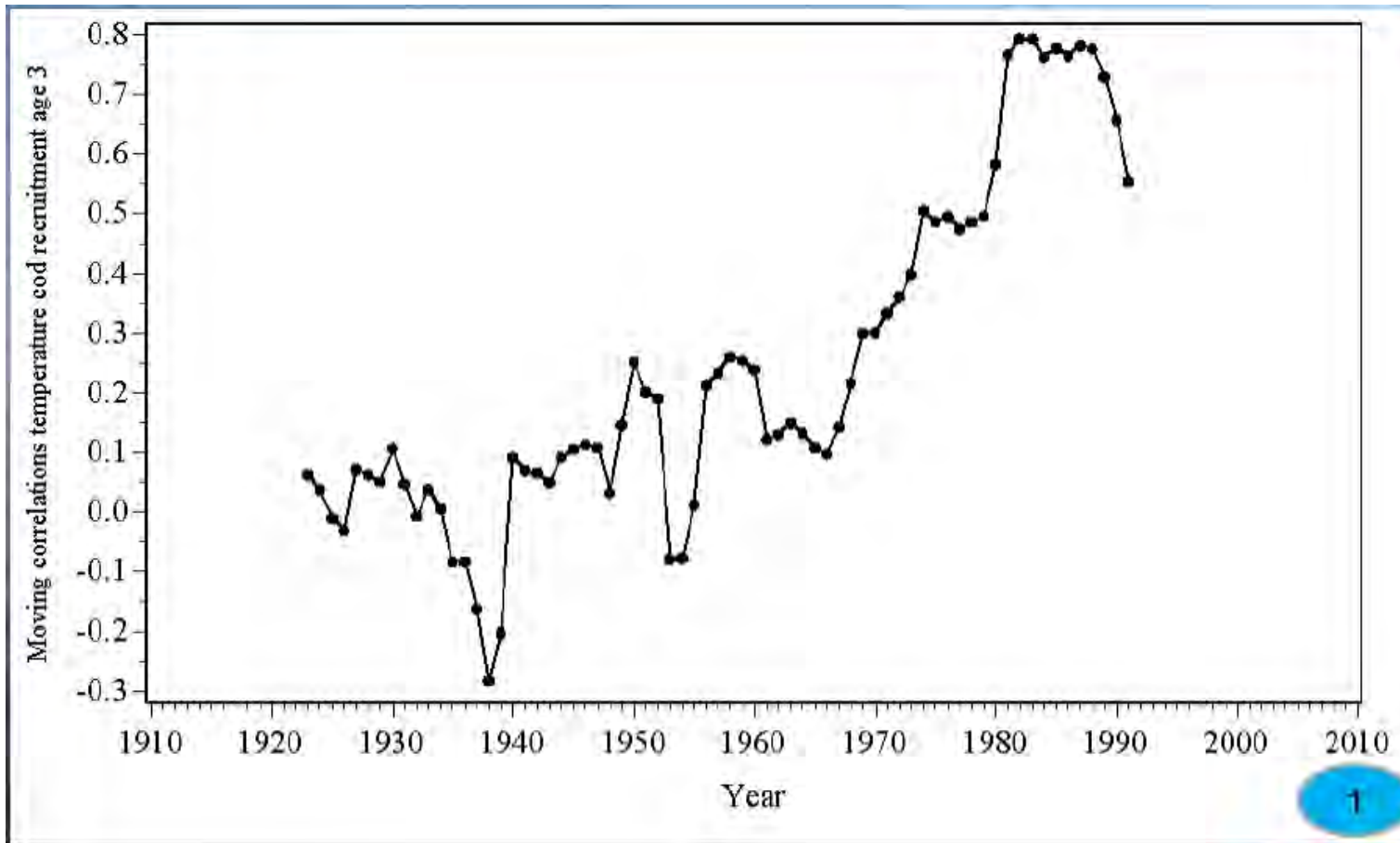
# Age 3 cod, Kola Section temperature in year of spawning



# Why did this change happen?

- We don't know
- Maybe thresholds on temperature effects?
- Cod SSB is at record level?
- Cod age structure is becoming more diverse?
- Herring has recovered from their collapse?
- Sea ice changes?
- Or something else?
- Or the wrong question entirely?

# Moving correlations between Kola sea-temperature and cod recruitment age 3 (21-year window)





# Modelling temperature impact

- Temperature has several effects in our models on the Barents Sea cod:
- Growth
- Consumption
  - Hence cannibalism on young fish
- Recruitment?
  - From adult spawners through to age 1 fish the following year

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# Modelling temperature impact

- Temperature has several effects in our models on the Barents Sea cod:
- Growth <- **Process based**
- Consumption <- **Process based**
  - Hence cannibalism on young fish
- Recruitment? <- **NOT process based**
  - From adult spawners through to age 1 fish the following year

# Recruitment "relationships"

•  ~~$E = MA$~~

~~Total Energy - Et:~~

$$\frac{\partial(E_T)}{\partial t} + \frac{\partial(uE_T)}{\partial x} + \frac{\partial(vE_T)}{\partial y} + \frac{\partial(wE_T)}{\partial z} = -\frac{\partial(up)}{\partial x} - \frac{\partial(vp)}{\partial y} - \frac{\partial(wp)}{\partial z}$$

$$+ \frac{1}{Re_r} \left[ \frac{\partial}{\partial x}(u\tau_{xx} + v\tau_{xy} + w\tau_{xz}) + \frac{\partial}{\partial y}(u\tau_{xy} + v\tau_{yy} + w\tau_{yz}) + \frac{\partial}{\partial z}(u\tau_{xz} + v\tau_{yz} + w\tau_{zz}) \right]$$

$$- \frac{1}{Re_r Pr_r} \left[ \frac{\partial q_x}{\partial x} + \frac{\partial q_y}{\partial y} + \frac{\partial q_z}{\partial z} \right]$$

- Recruitment is some function of: SSB, salinity, currents, food, predators, temperature, adult size and condition, spatial overlap, somehow, probably, maybe

# Regression relationships

- Just seen from how complex it is to quantify and model even part of this process
- Most models use regression on one (or more) environmental variables to fill the gap
- Fine for describing what has happened
- Problematic for predictions
  - Moving beyond range of observations
- Widely used in ecosystem/multispecies modelling

# Projecting regression relationships

- At some point in the changing future any regression relationship is likely to change
  - **Don't** know when
  - **Don't** know how
- Have no data to quantify these uncertainties
  - Can't bootstrap data that doesn't exist
  - Bayesian doesn't help without data
  - Ensemble modelling can't help quantify these
- **=> Unquantifiable uncertainty**
- Does it matter to our stock projections?

# The small question

- Here is our specific question:
  - Are there significant effects on model projections from the (unquantifiable) uncertainty in the breakdown of the historical temperature recruitment relationship?
- Here this breakdown has happened in the past, so we have data on the change
- Similar breakdowns can be expected in other regression relationships



# STOCOBAR model

- Russian developed, Barents Sea model
- Process-based, forward simulation model
- Multi species/extended single species
- Focused on cod
  - With stochastic prey species
  - Incorporating environmental drivers
- Age-structured, single-area and single-fleet model, one-year time step

# STOCOBAR

## Input data

### Report of ICES AFWG 2010

Capelin stock biomass, 1972-2009

Cod stock parameters, 1972-2009

- abundance by age;
- weight- at-age in stock
- length-at-age in stock
- weight-at-age in catch;
- coefficient of fishing mortality;
- maturation ogive.

### Data of PINRO

Cod fatness (hepatosomatic index)

1984-2007;

Temperature at the Kola Section,  
1951-2009

### Joint Russian-Norwegian database

Cod stomach content, 1984-2008

# Recruitment

- Estimated Ricker relationships for “number of age 1 required for the model to fit at age 3+”
- Not: “actual number of age 1 fish recruited”
- If we had done this a few years ago we might have included temperature as a parameter
- Today probably not
  
- **How much difference does this make?**

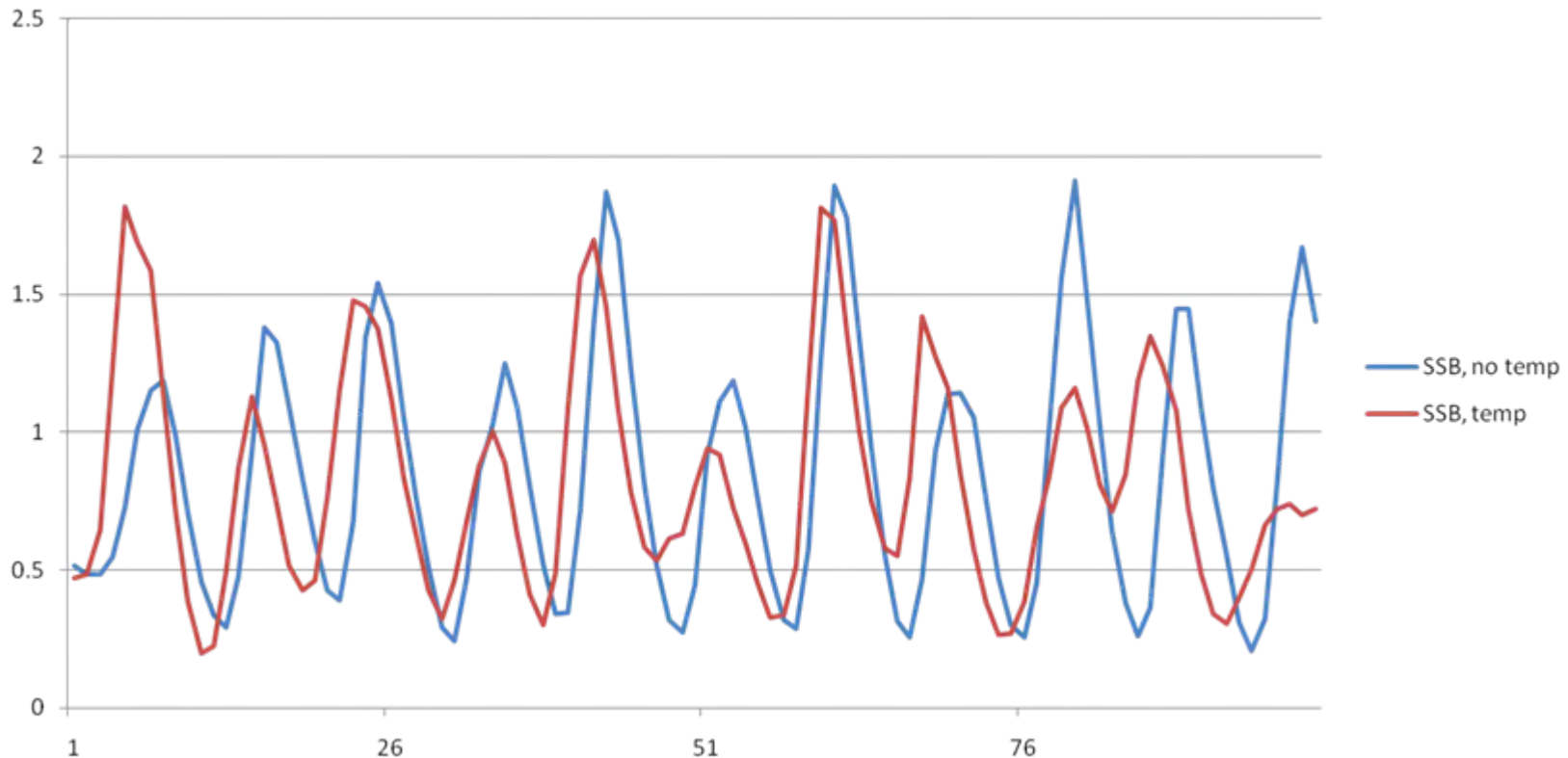
# Forward simulations

- Stochastic temperature based on historical data
- Add a warming trend of +0, +1, +2, +4 degrees after 100 years
- **Two alternatives: With and without temperature in recruitment**
  - Still in growth and consumption for both cases
- Approximation to current management rules
- Assume high carrying capacity
- Just showing SSB here for the sake of time

# SSB RESULTS: +0 degrees

- Average biomass: 0.83 / 0.84 million tonnes

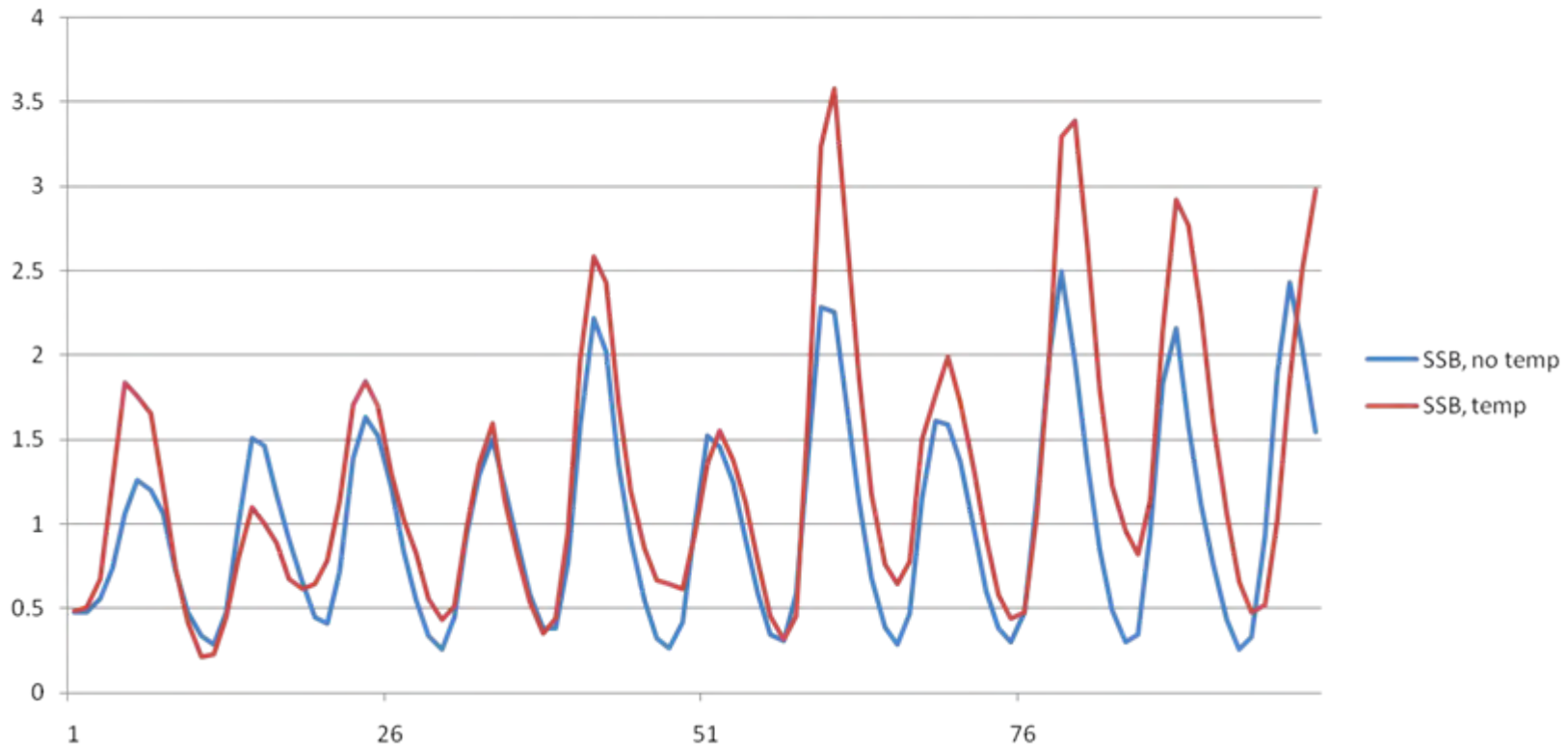
T after 100 years, +0 degrees



# SSB RESULTS: +1 degree

- Average biomass: 1.28 / 1.01 million tonnes

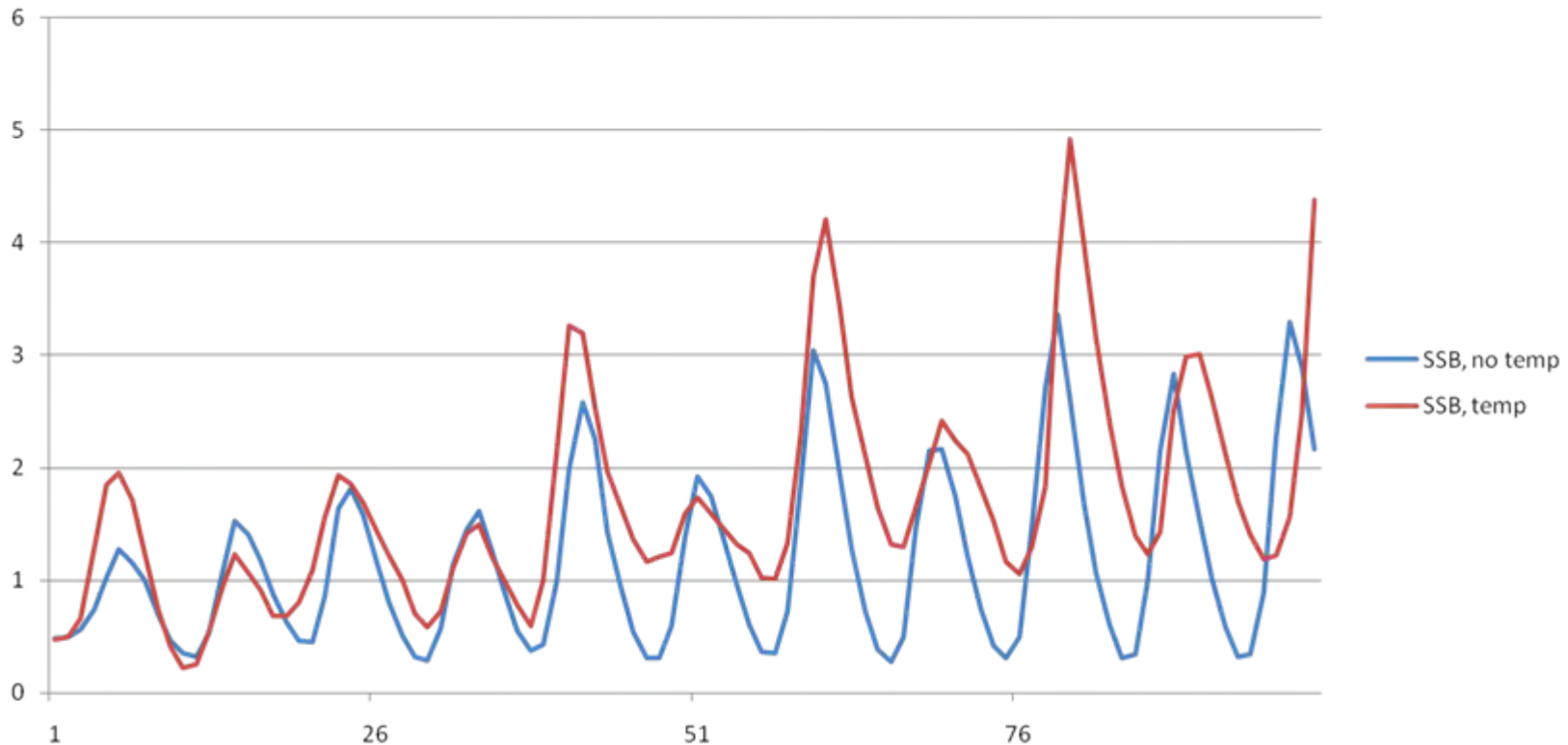
T after 100 years, +1 degrees



# SSB RESULTS: +2 degrees

- Average biomass: 1.68 / 1.18 million tonnes

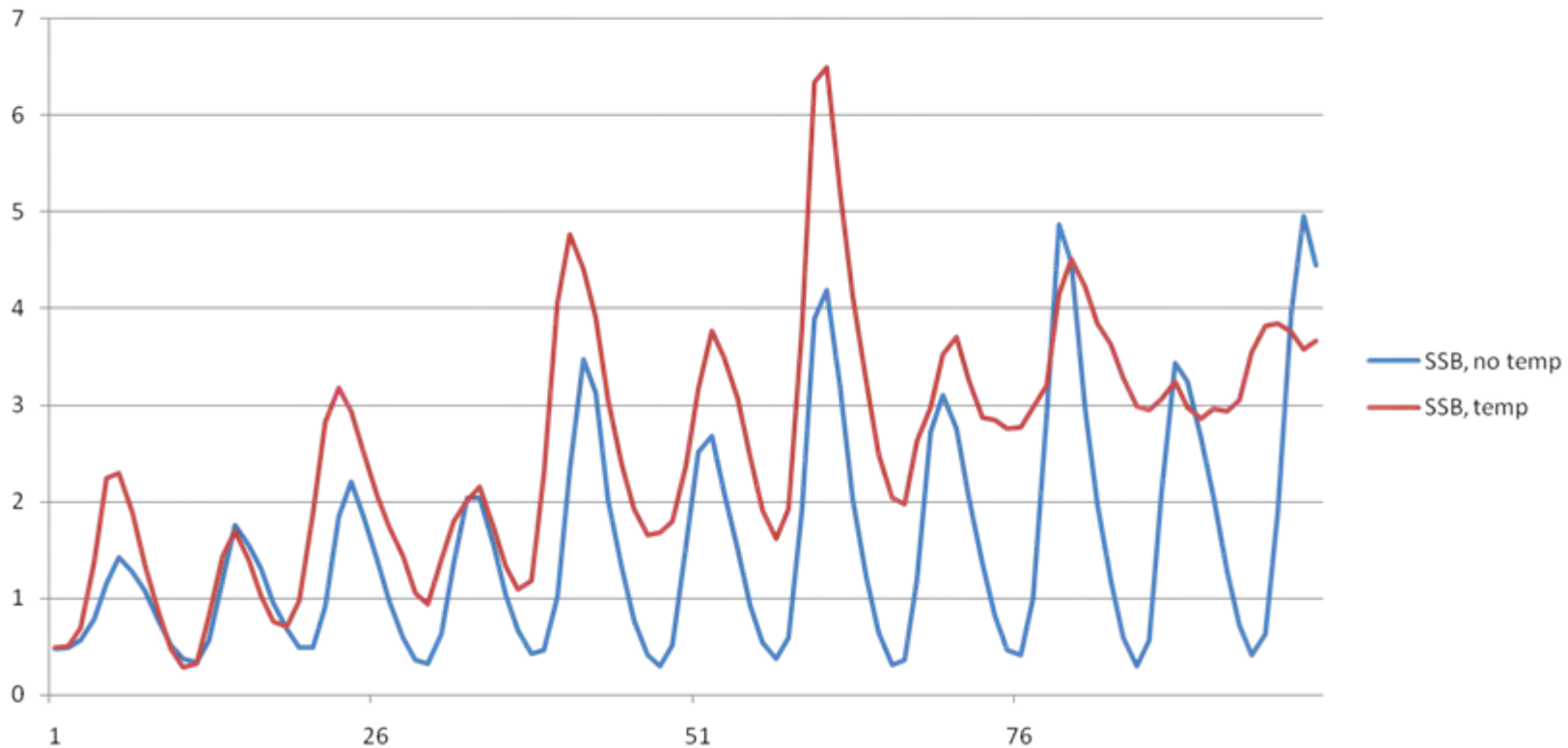
T after 100 years, +2 degrees



# SSB RESULTS: +4 degrees

- Average biomass: 2.55/ 1.54 million tonnes

T after 100 years, +4 degrees





# Results

- The **unquantifiable uncertainty** from using regression as a basis for the temperature part of the recruitment relationship for the Barents Sea cod produces major changes in predicting:
  - Overall stock levels
  - Stock dynamics
  - Minimum biomass
  - Optimum management
    - MSY, Precautionary

# Answers to our small question

Are there significant effects on model projections from the (unquantifiable) uncertainty in the breakdown of the historical temperature recruitment relationship?

- Did the uncertainty matter: YES
- Could we quantify it: NO

# Step Back

- These are results for NEA cod
- Specific to our ecosystem
- Specific to the particular model we used
  
- But:
  
- Similar effects from changes in regression relationships are likely in any ecosystem and any ecosystem model

# What we can do

- Quantify some sources of uncertainty
  - But not all
- Produce “plausible” scenarios (ensemble)
- Run Management Strategy Evaluations for these scenarios
  - Identify where management rules are robust
  - Identify indicators that we may be moving to conditions where the management rule may fail
- **But** in terms of quantifying overall uncertainty:

## Conclusions:

- Can we, with *any reasonable degree of certainty*, predict future stock trends?

**No**

- Can we, with any *quantifiable degree of uncertainty*, predict future stock trends?

**No**

- Are we likely to do so *in the foreseeable future*?

**No**

**Questions?**

- 1. Regression relationships tend to break down when projected beyond data
- 2. By definition there is no data to quantify the probability or nature of this change in advance
- 3. These changes can have a large impact on model projections
- 4. Most (all?) ecosystem models rely on regression relationships.
- Therefore: none of these models can quantify the overall uncertainty in their projections, unless they remove the reliance on regression relationships