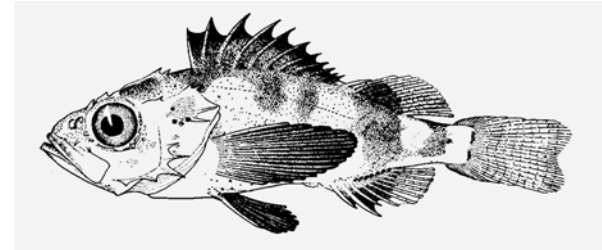


# On the (A)Synchrony of Long-Term Sea Surface Temperature Trends in the Western and Eastern North Pacific

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Steven Bograd, Roy Mendelssohn, Frank Schwing, Cindy Bessey  
SWFSC, Environmental Research Division  
Pacific Grove, California  
[steven.bograd@noaa.gov](mailto:steven.bograd@noaa.gov)





# Outline and Objectives

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- Compare climate patterns using a variety of statistical methods.
- Apply state-space models to North Pacific SST.

## DATA

- UK Meteorological Office, Hadley Centre, SST Dataset (HadISST1.1), and Reynolds OISST.v2
- Monthly, 1-degree resolution, global, 20th century
- California Current, Gulf of Alaska, Oyashio, Kuroshio regions



# Compelling Questions

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- How do we define & quantify climate variability?
- Are regime shifts real? If so ...
  - What is the timing and morphology of climate regimes?
  - What is their 3-D spatial structure?
  - What are their causes & forcing mechanisms?
  - What are the biological responses & pathways?
  - How are regime impacts modulated by local processes?
  - Do North Pacific ecosystems vary in or out of phase?



# Methodological Approach

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- Apply variety of tools for identifying climate variability.
  - Observations, anecdotal reports
  - Anomaly time series & fields
  - EOF analyses
  - Decomposition of PDO & other indices
  - State-space models of physical & biological series
  - Common trend analyses amongst regions
- Describe temporal co-variability amongst North Pacific Large Marine Ecosystems on climate scales.
- Propose mechanisms for co-variability.
- Develop easy-to-use indices of climate-fisheries linkages.

# State-Space Time Series Models

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## (1) State-space decomposition of time series

$$\mathbf{Data}(t) = \mathbf{Trend}(t) + \mathbf{Seasonal}(t) + \mathbf{Irregular}(t) + \mathbf{Error}(t)$$

*Trend - non-linear and non-parametric*

*Seasonal - non-stationary, changes in phase and amplitude*

*Irregular - can include AR or non-stationary cyclic term*

*Error - allow for observational error*

# State-Space Time Series Models

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- (1) State-space decomposition of time series

$$\mathbf{Data}(t) = \textcolor{blue}{\underline{Trend}(t)} + \textcolor{red}{\underline{Seasonal}(t)} + \textit{Irregular}(t) + \textit{Error}(t)$$

*Trend - non-linear and non-parametric*

*Seasonal - non-stationary, changes in phase and amplitude*

- (2) Dynamic factor analysis of partial residuals  
(trends, seasonals, ...)



Compare first two common SST trends in all regions

# Why State-Space Models?

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- Distinguish low-frequency trends, AR, cyclic processes
- Quantify non-stationary seasonality → phenology!
- Avoid rigid assumptions (constant mean, variance)
- Time dependence in model (Kalman filter)
- Rigorous model testing to determine best model
- Long history of time series applications, though new to oceanography
- Matlab system identification toolbox, numerous texts

# Why State-Space Models?

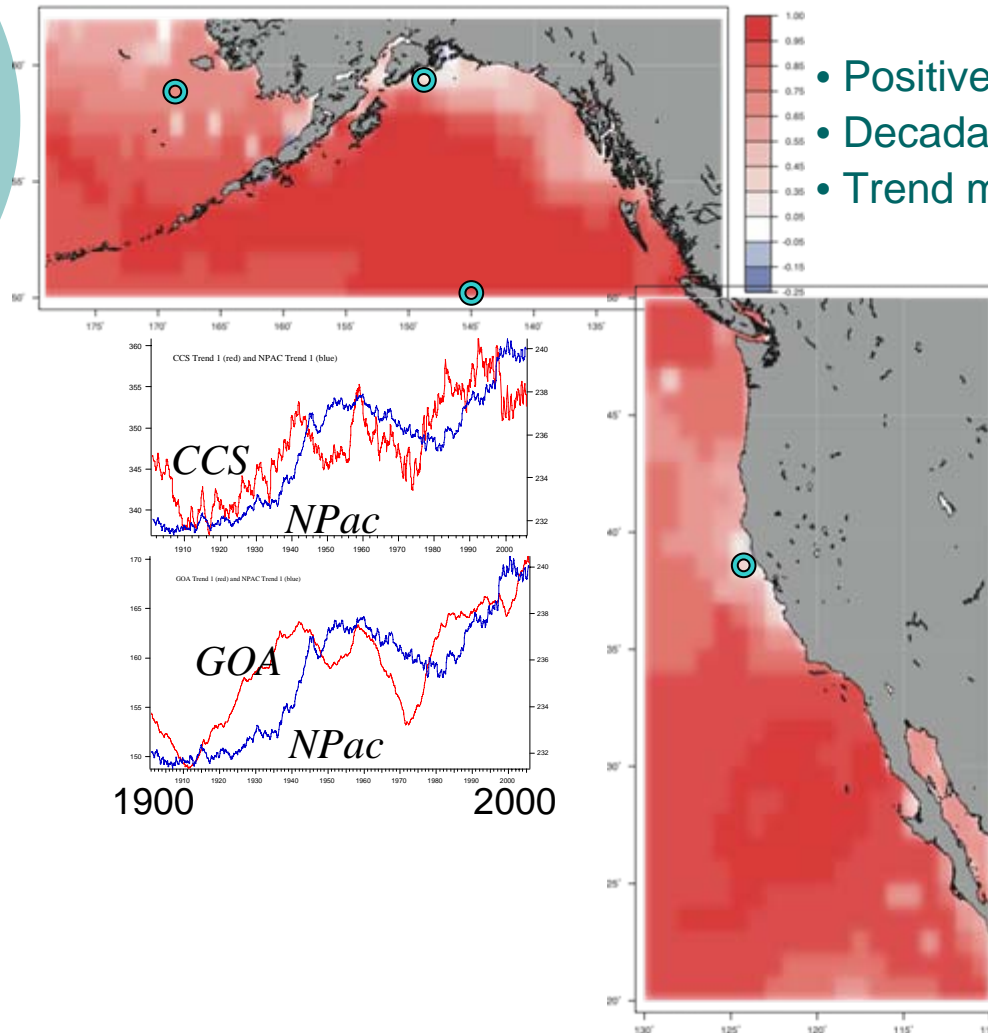
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... EOFs also good



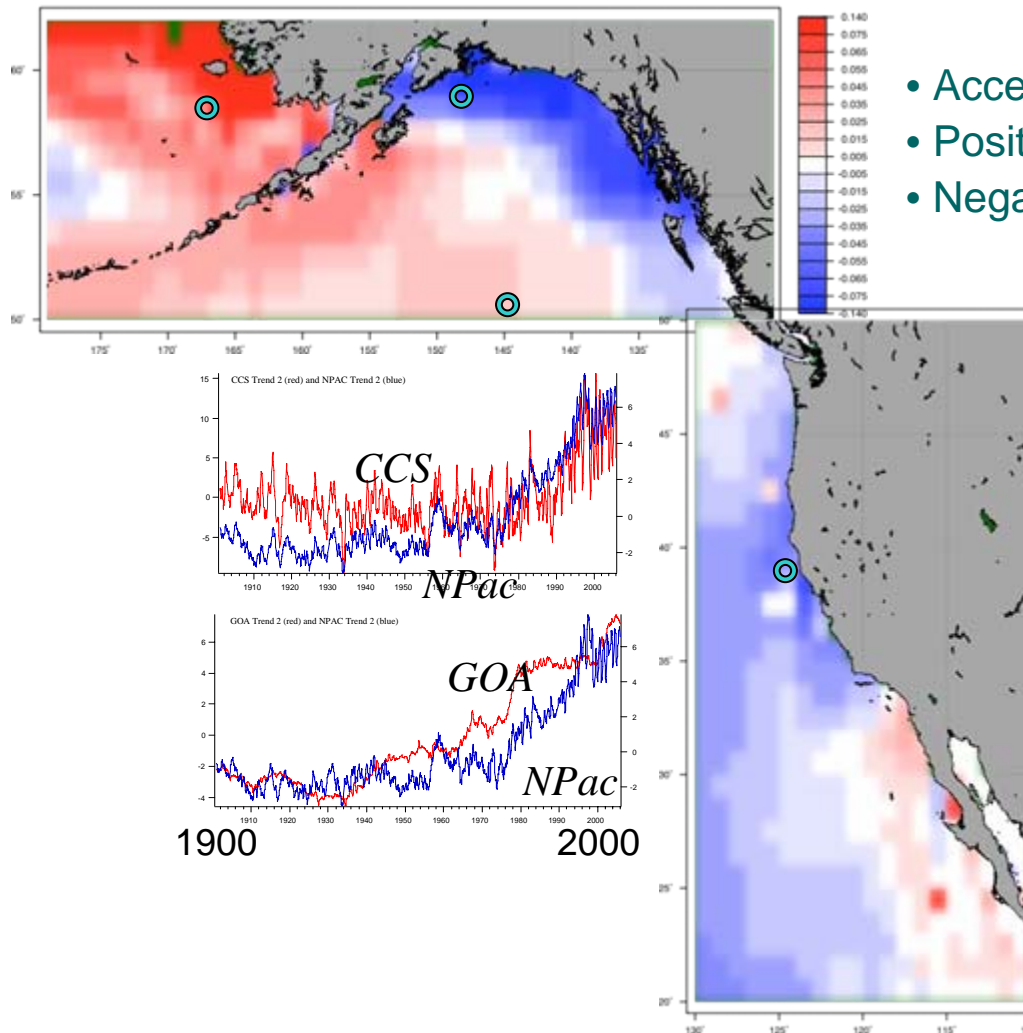
# Common SST Trends in the Northeast Pacific



- Positive correlations throughout domain
- Decadal fluctuations on overall warming trend
- Trend mitigated in coastal CCS, northern GOA

Mode 1:  
“global SST mode”

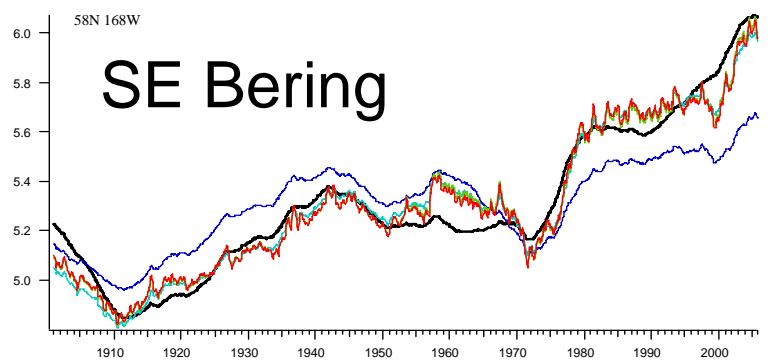
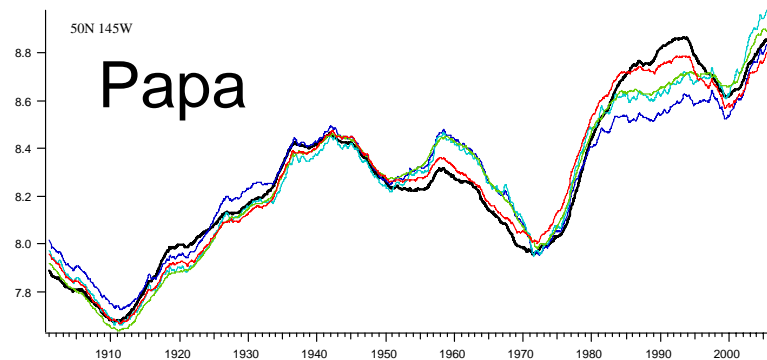
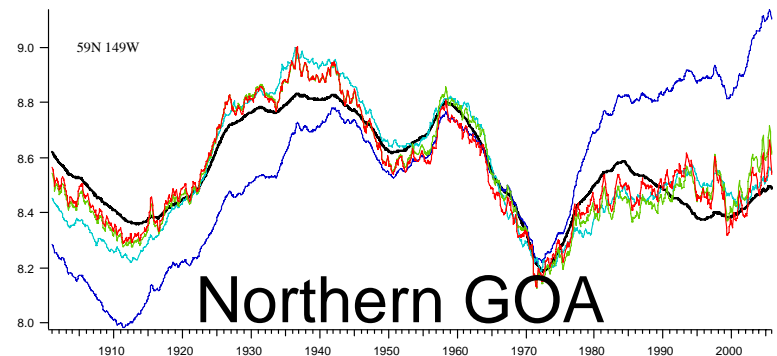
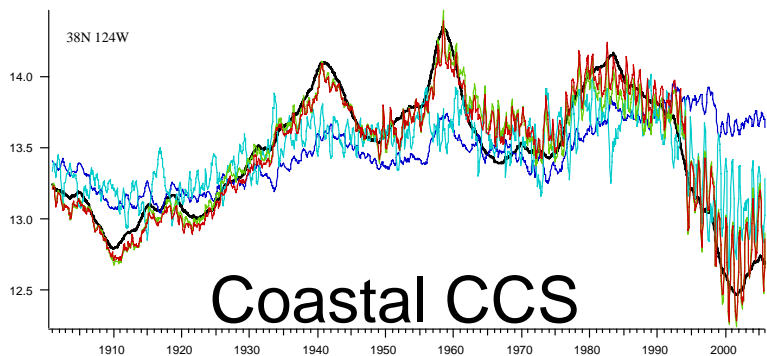
# Common SST Trends in the Northeast Pacific



- Accelerated T change since 1970s
- Positive loadings = enhanced warming
- Negative loadings = mitigated warming

**Mode 2:**  
“global warming mode”

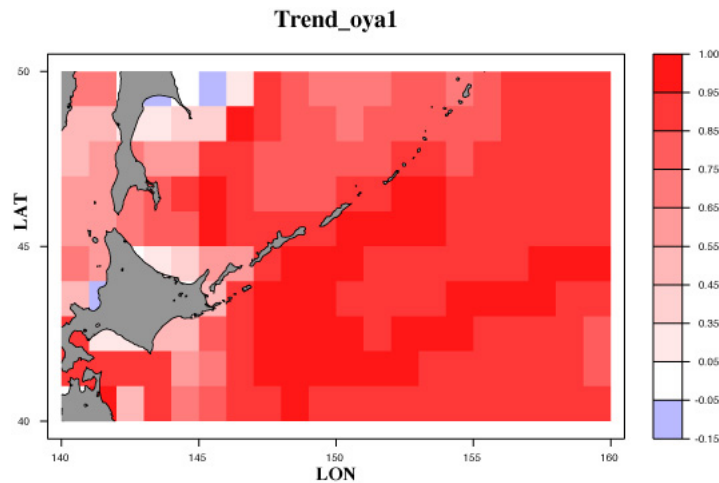
# Common SST Trends in the Northeast Pacific



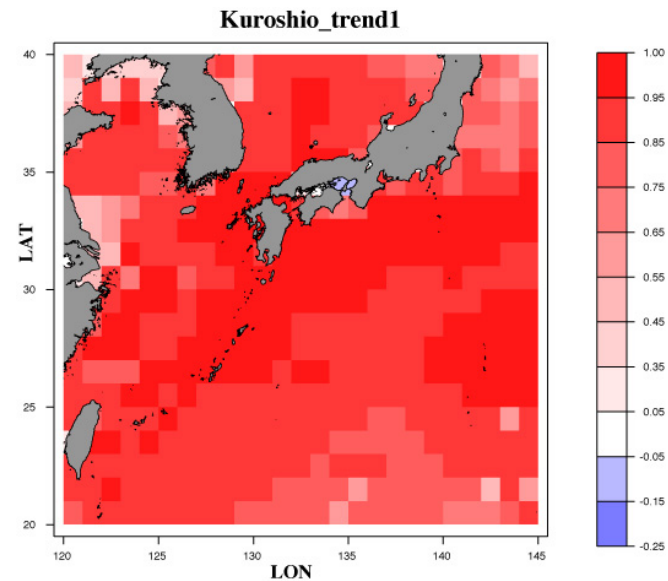
— Trend  
— Comp 1  
— Comp 1+2  
— Comp 1+2+3  
— Comp 1+2+3+6

(... “PDO” is 4th Mode)

# Common SST Trends in the Northwest Pacific

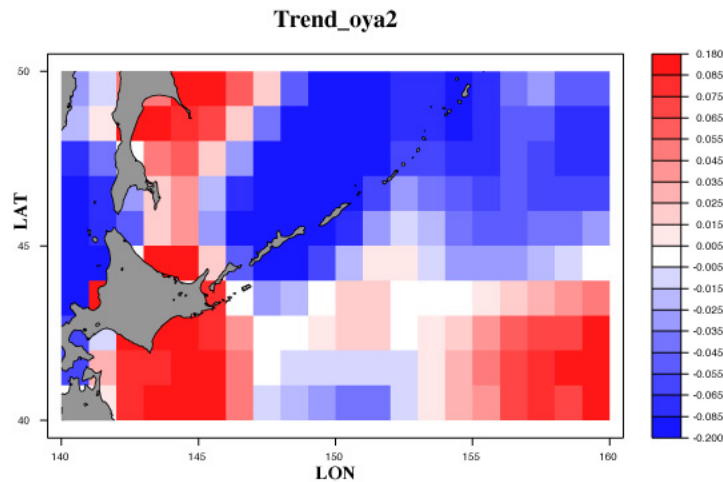


Oya SST Trend I (solid) and Kuro Trend I

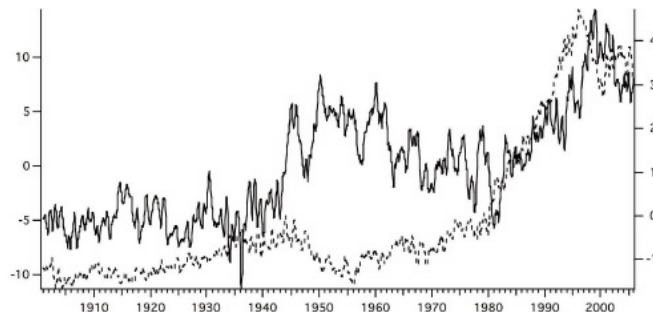
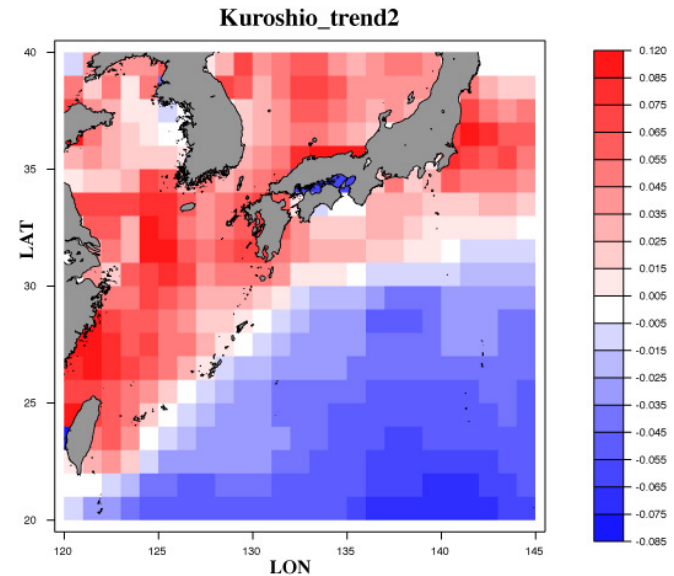


- Overall warming trend, accelerated since 1980s
- Positive correlations throughout domain

# Common SST Trends in the Northwest Pacific



Kuro SST Trend2 (solid) and neg. Oya Trend 2

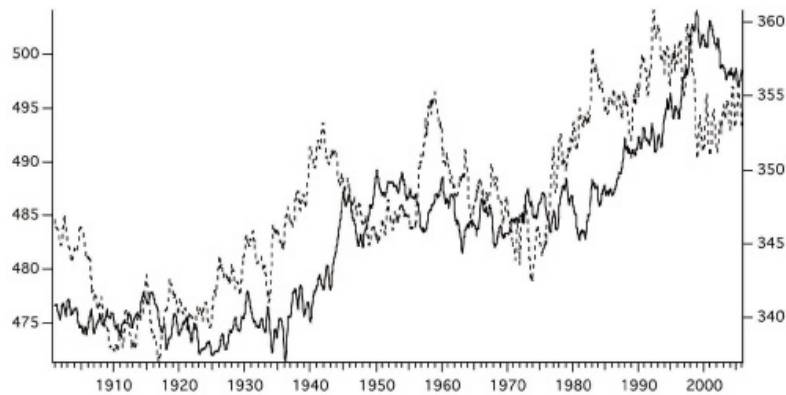


- Enhanced warming offshore northern Japan, and East Asian Seas

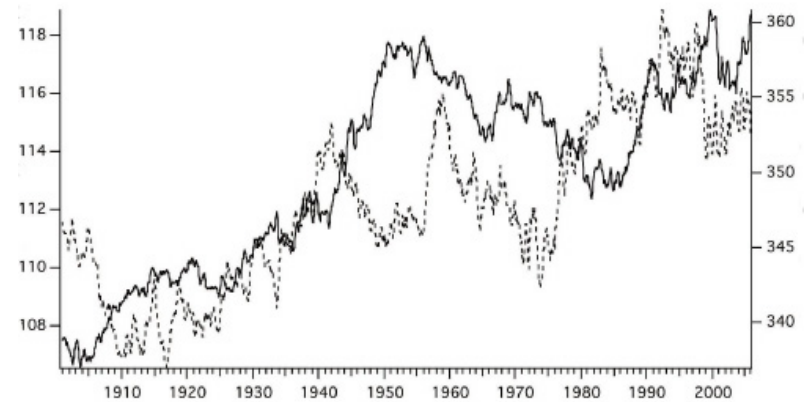
# Common SST Trends in the Northwest Pacific

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Kuro SST Trend I (solid) and CCS Trend I



Oya SST Trend I (solid) and CCS Trend I



- Similar warming trend in Eastern & Western North Pacific, with lags

# Summary

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- Different methodological techniques provide unique insight.
- Standard indices of “regime shifts” may be capturing red noise, rather than dominant dynamic processes.
- Biology can respond to red noise ... (Hsieh et al., 2005)
- Robust warming trend throughout North Pacific, with decadal modulation.
- Large-scale climate signals are asynchronously modulated by local processes.
- Need climate models that can resolve regional processes (upwelling strength & timing, FW input, ...).

# Unanswered Questions

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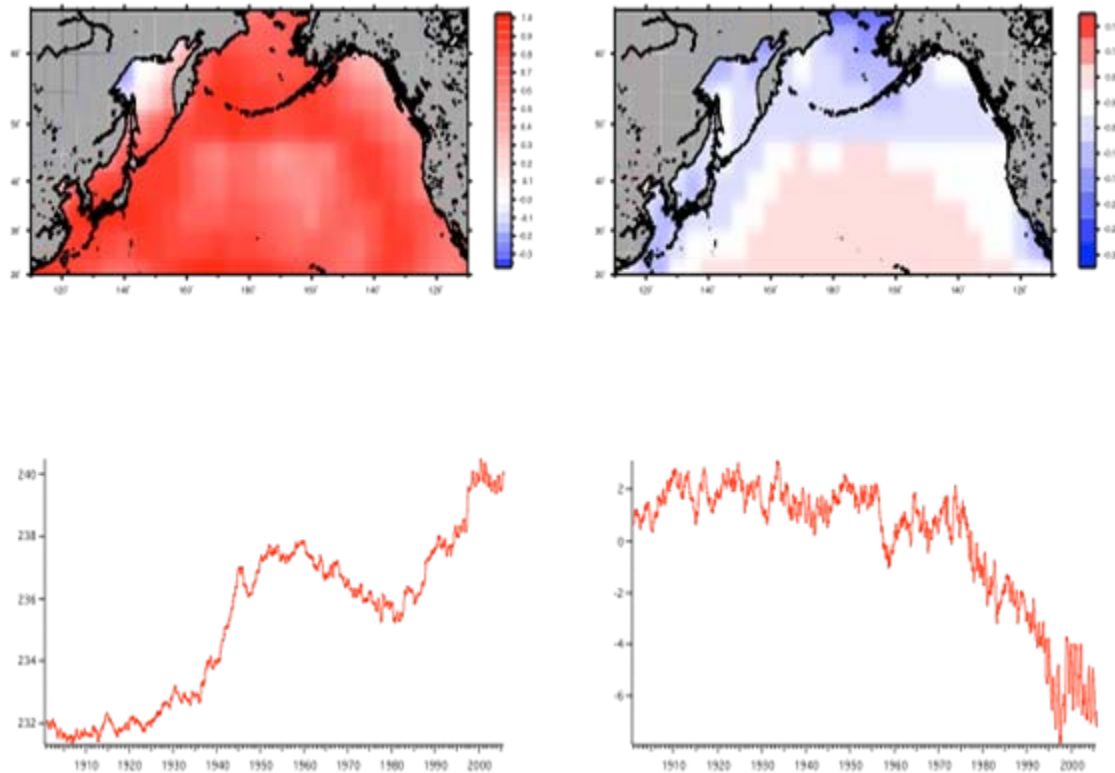
- Are regime shifts real and quantifiable?
- Are they a biological or physical phenomenon (or both)?
- How do we capture their ecological impacts with indices?
- How do local processes modulate large-scale climate forcing?
- What is the sensitivity of marine ecosystems to future climate change scenarios?



*Thanks to U.S. GLOBEC, NOAA FATE program!*



# The PDO Revisited ...



# The PDO Revisited ...

