

# Modeling Peru Upwelling Ecosystem: from Physics to Anchovy

Prof. Fei CHAI

University of Maine, USA

Second Institute of Oceanography, China

Collaborators:

Yi Xu, Lei Shi, Peng Xiu, Yi Chao,  
Kenneth Rose and Francisco Chavez

# Outline

- Needs & challenges of modeling ecosystems
- Physical and ecosystem models (ROMS-CoSiNE)
- Peruvian Anchoveta - Individual Based Model (IBM)
  - Seasonal and Interannual Variability
  - 0-D vs 3-D IBM results comparison
- End-to-end ecosystem modeling for CCS
- Summary and Recommendations

# Human activities and climate change have altered coastal and marine ecosystems



# Coastal and Marine Ecosystem Stressors

## Climate Change

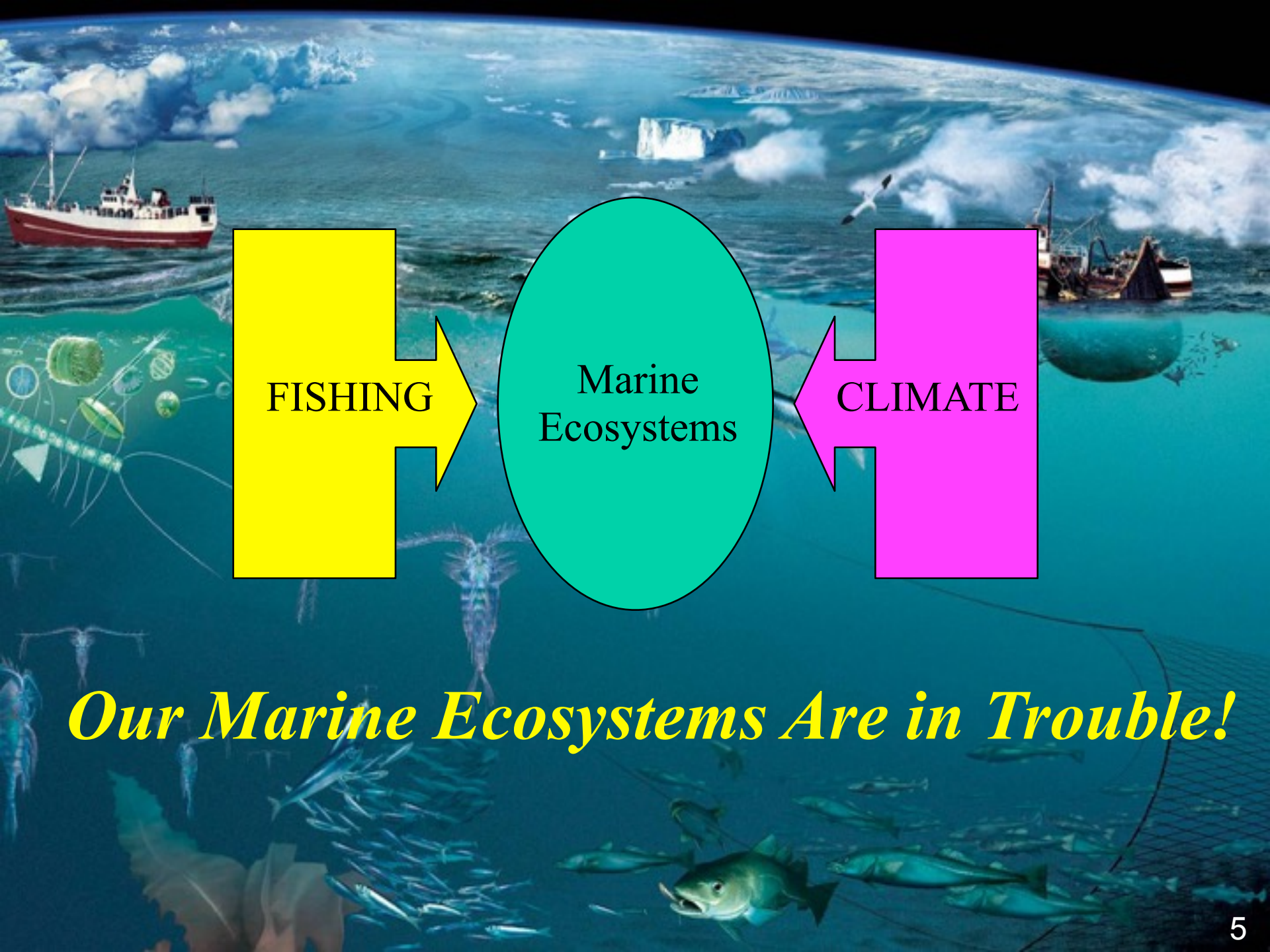
- Global warming
- Precipitation & runoff
- Sea-level rise
- Storms & extrem events
- Ocean acidification

## Non-Climate

- Overfishing
- Eutrophication
- Loss of habitats
- Land reclamation

**As the world population grows,  
demand for ocean services continues to increase**





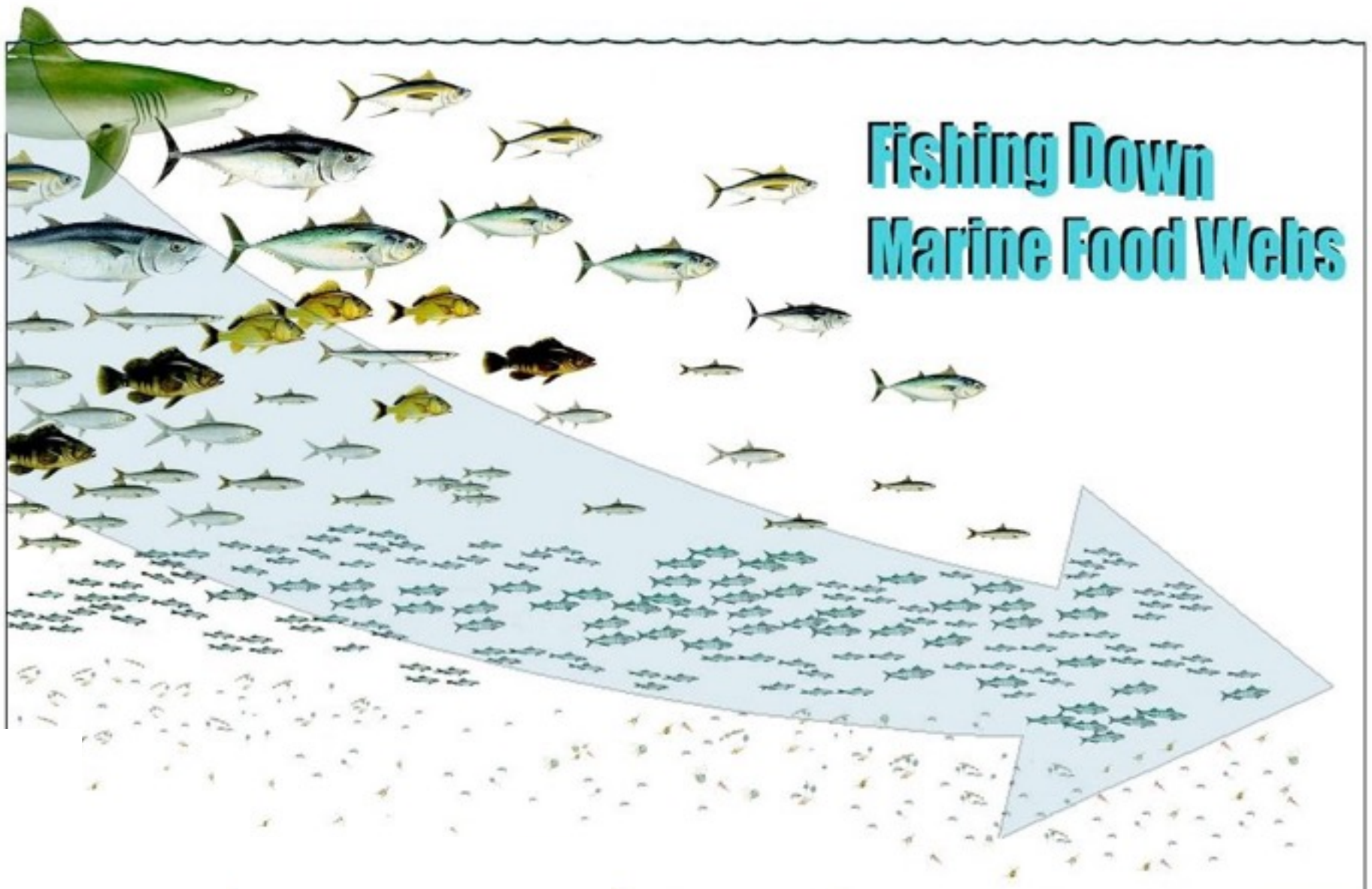
FISHING

Marine  
Ecosystems

CLIMATE

*Our Marine Ecosystems Are in Trouble!*

# Fishing Down Marine Food Webs



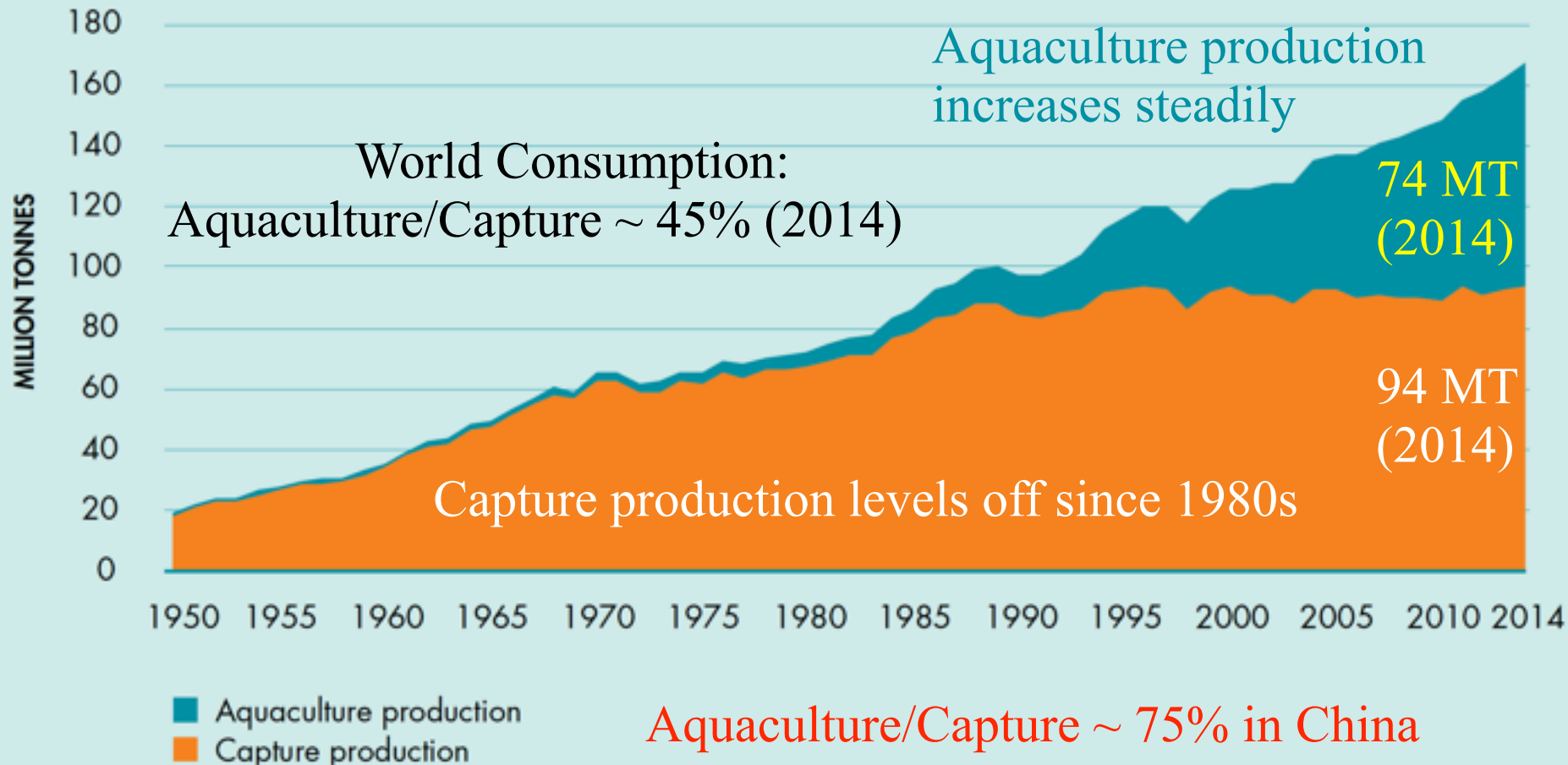
time

(Adapted from Pauly, 1998 )

# FAO Report (2016): The State of World Fisheries and Aquaculture

FIGURE 1

## WORLD CAPTURE FISHERIES AND AQUACULTURE PRODUCTION

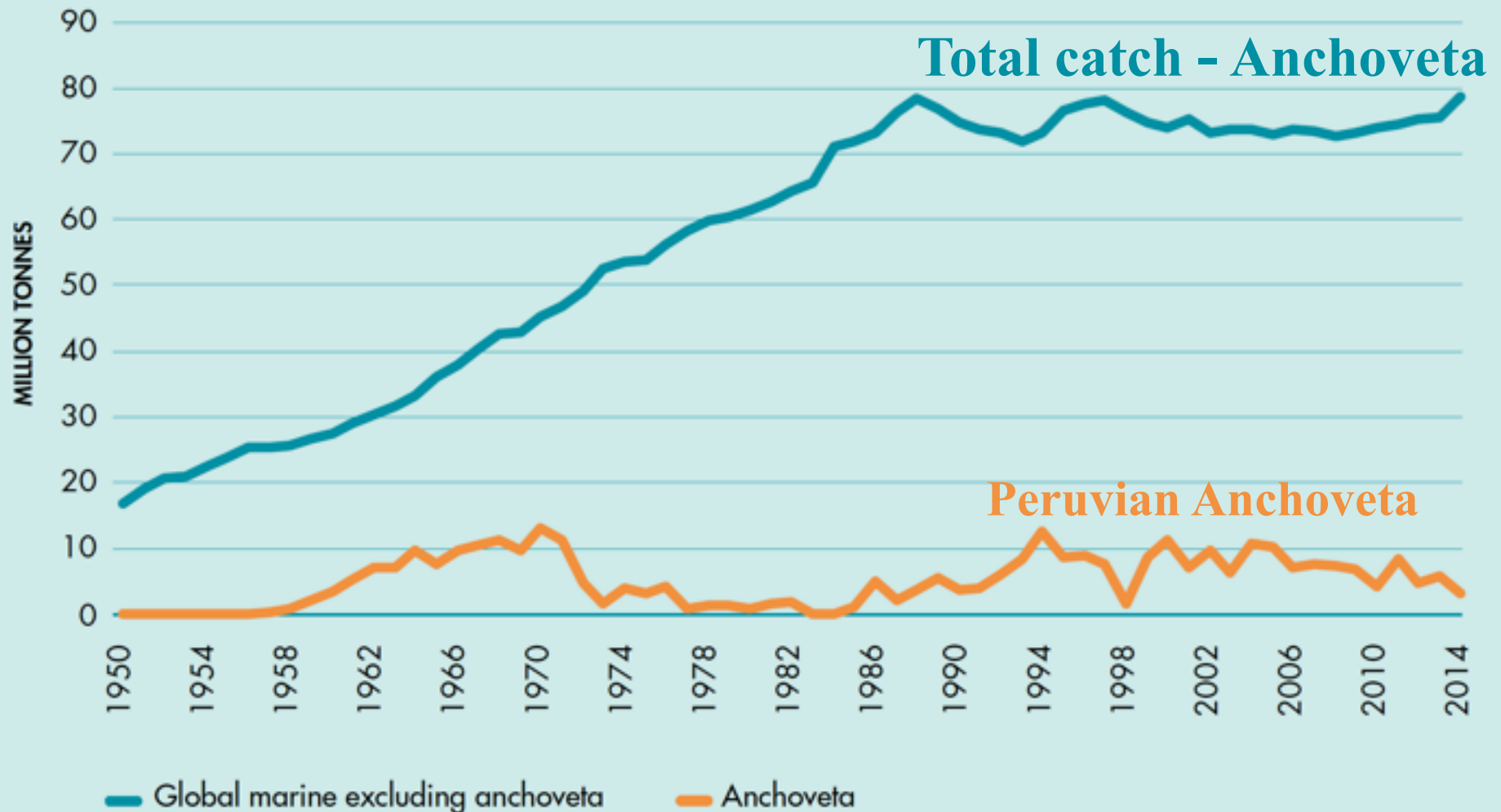




# FAO Report (2016): The State of World Fisheries and Aquaculture

**FIGURE 3**

## TRENDS IN GLOBAL MARINE CATCHES, SEPARATED DATA FOR ANCHOVETA





**Peruvian fisherman noticed  
the current reversal around  
Christmas, and named it as  
“El Nino”**



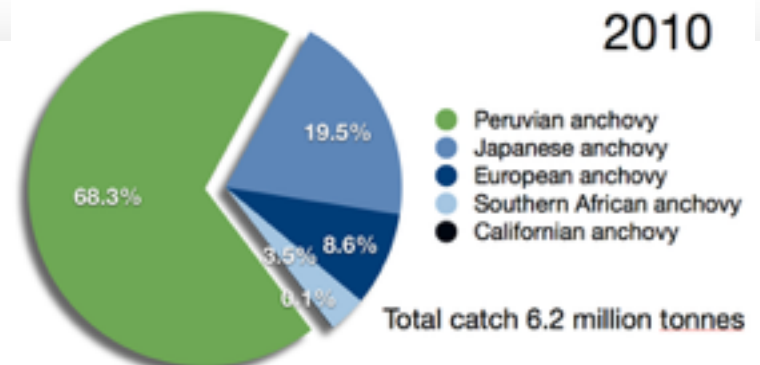
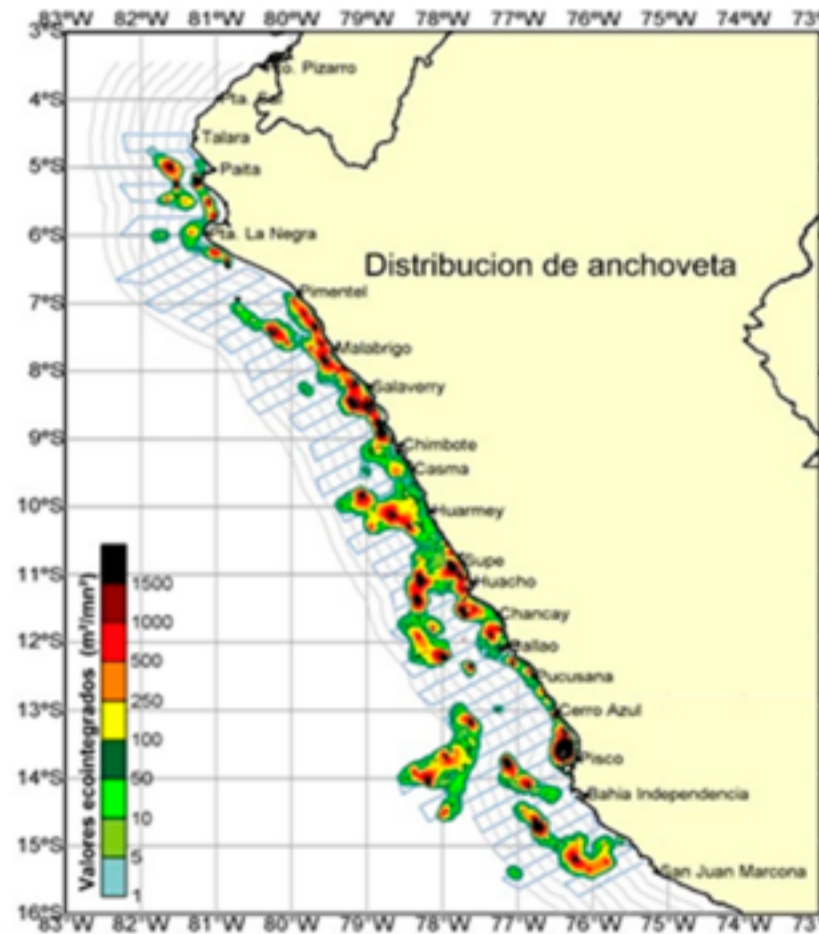
In the year 1891, Senor Dr Luis Carranza, President of the Lima Geographical Society, contributed a small article to the Bulletin of that Society, calling attention to the fact that a countercurrent flowing from north to south had been observed between the ports of Paita and Pacasmayo.

The Paita sailors, who frequently navigate along the coast in small craft, either to the north or the south of that port, name this countercurrent the current of "El Niño" (the child Jesus) because it has been observed to appear immediately after Christmas.

# Peruvian anchoveta fishery today

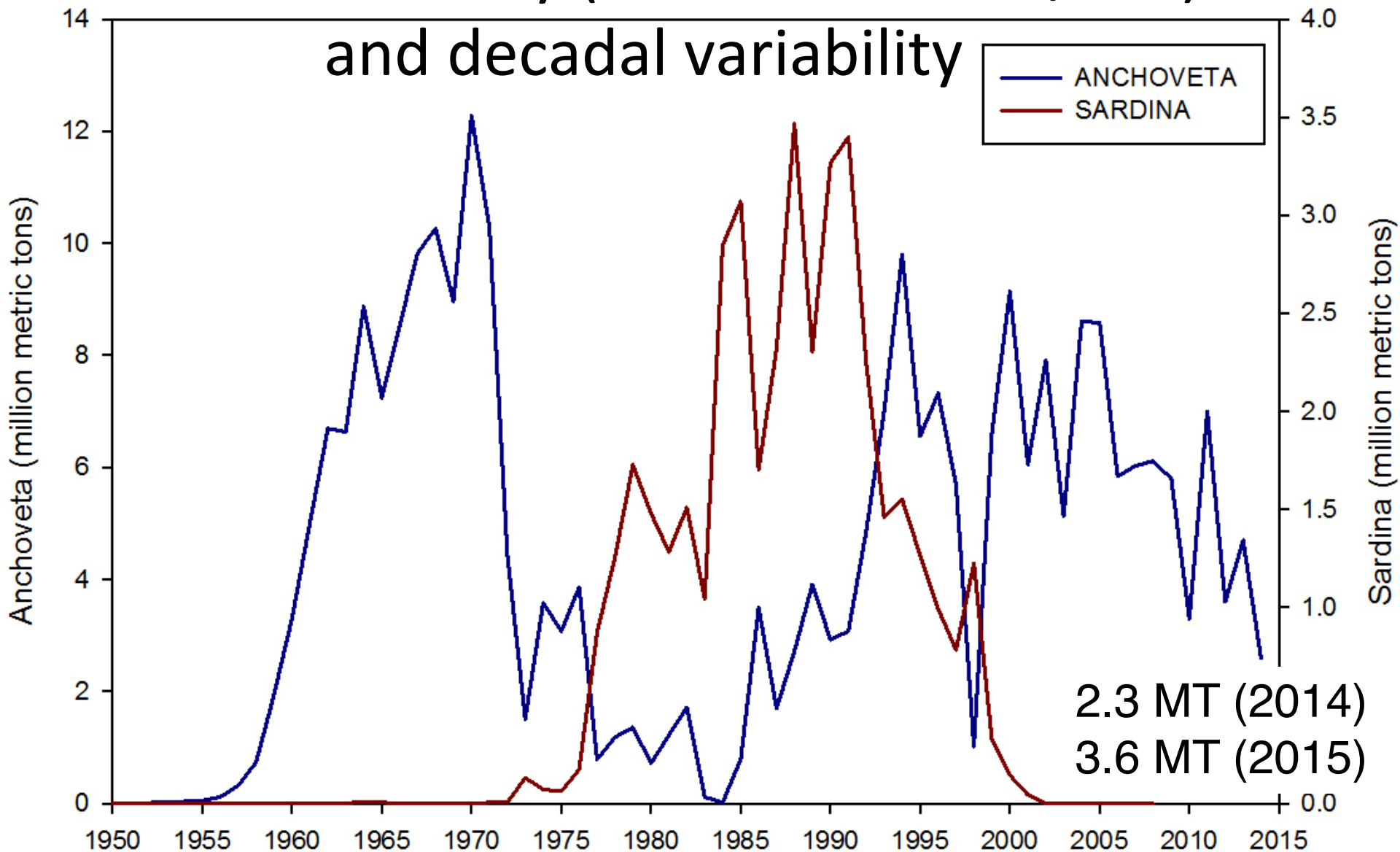


Fishery Location: Peruvian waters, Chimbote.

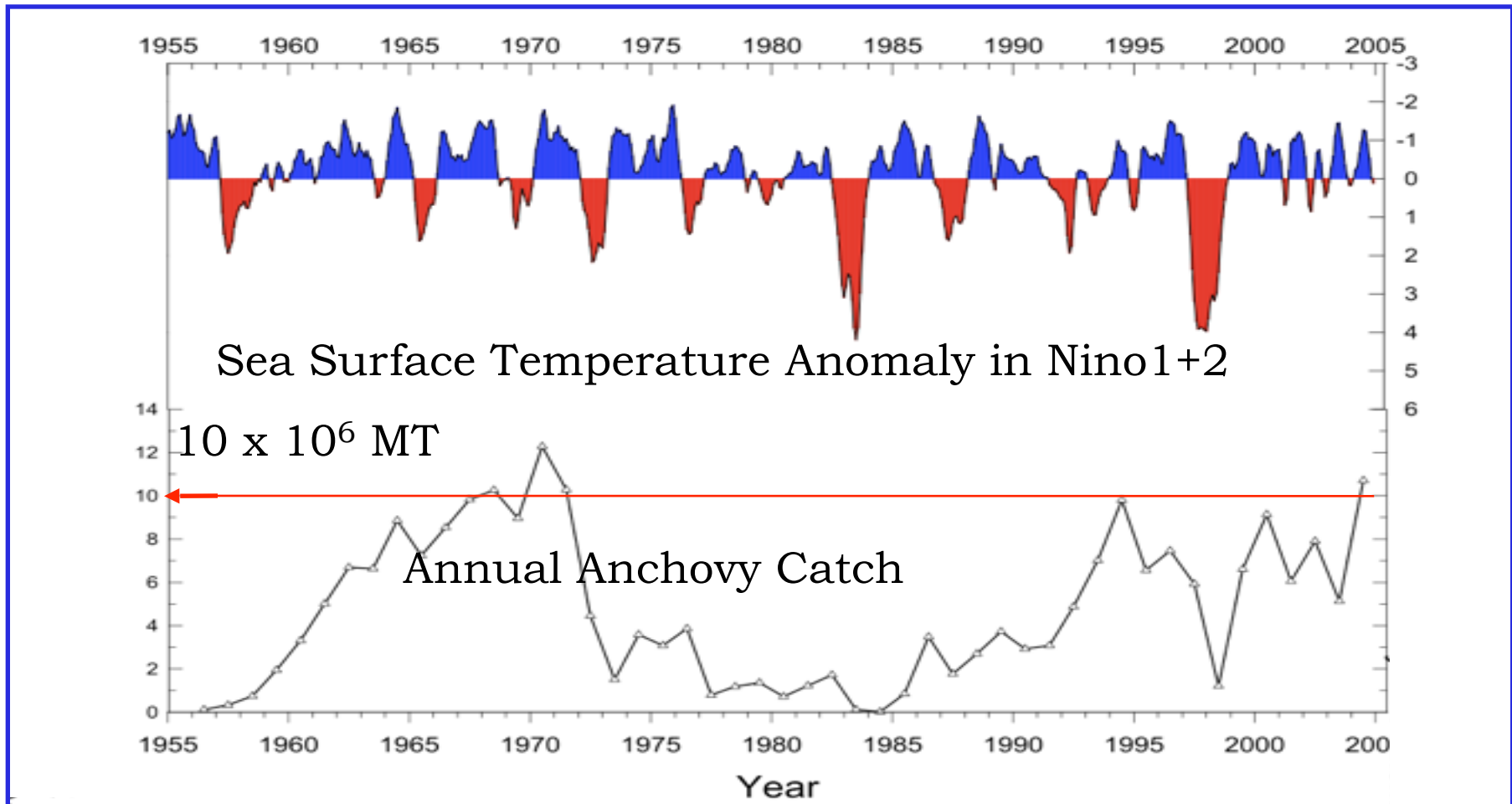


# ENSO, PDO, Peruvian *Anchoveta* and *Sardine*

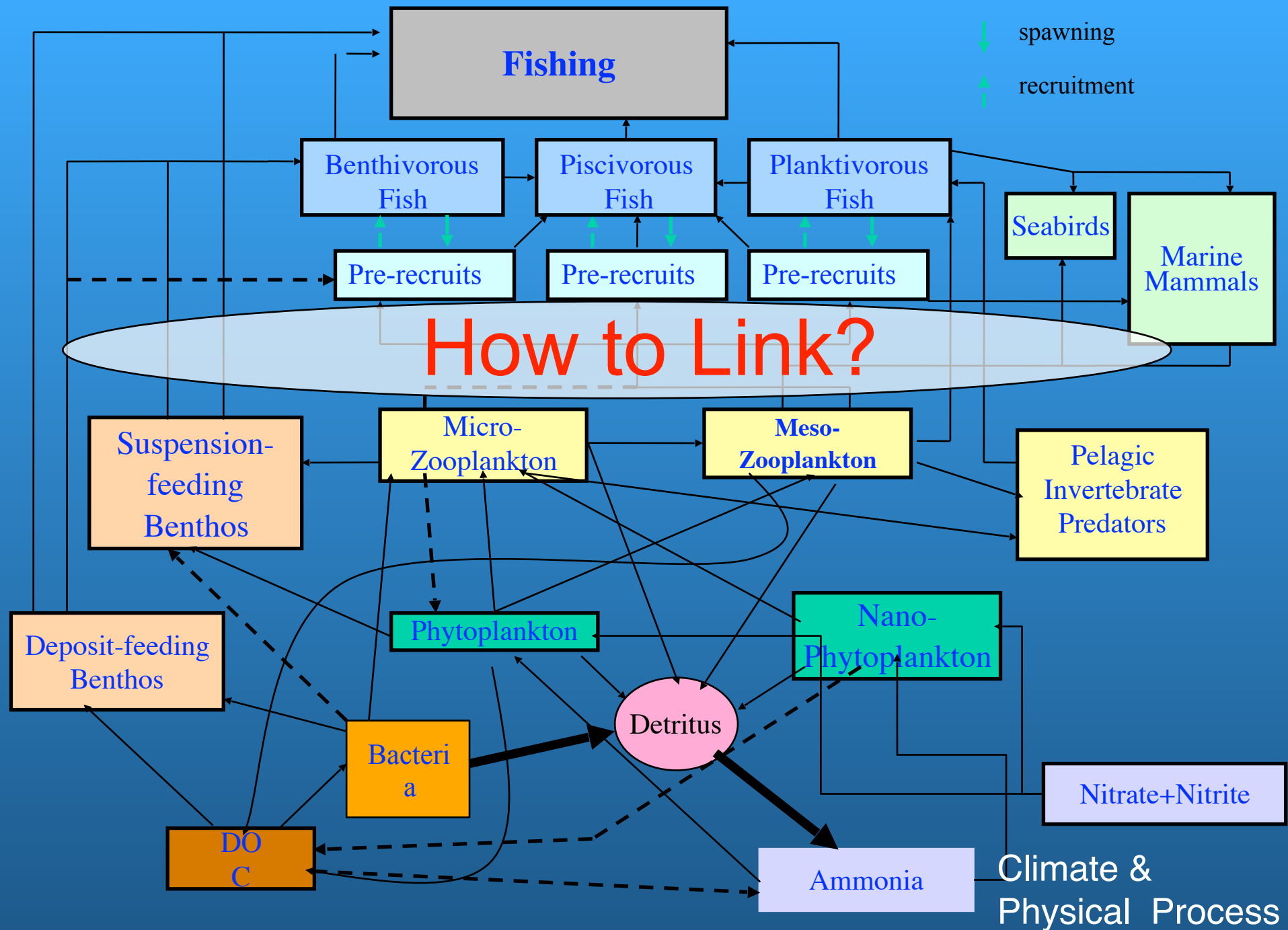
## The link to today (El Niño 2014-15/16?)



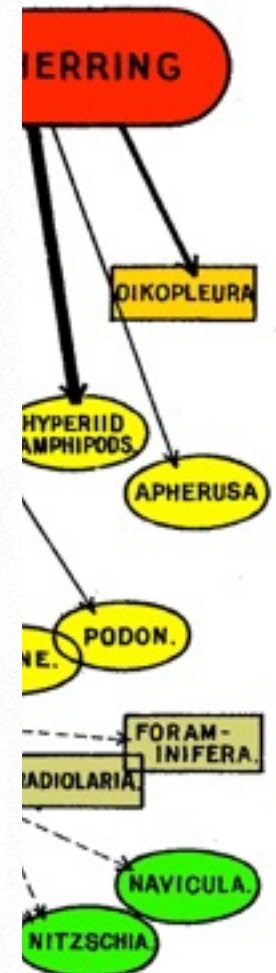
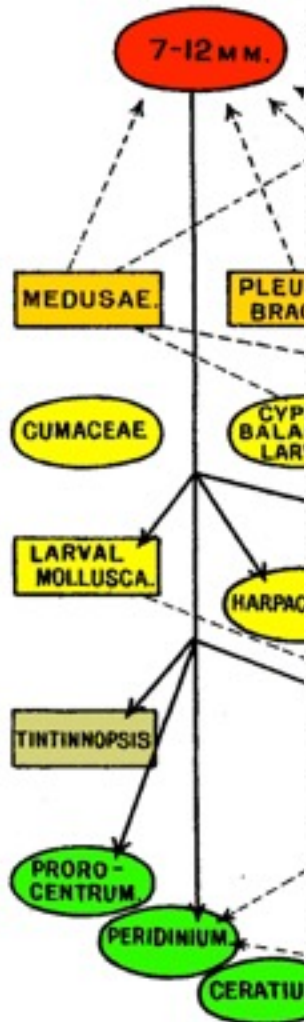
# El Nino and Peruvian Anchovy Fishery







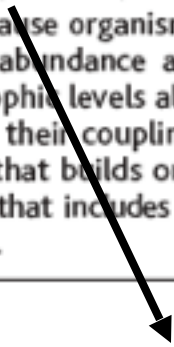
# A Sketch of Herring Population Model (from A.C. Hardy, 1924)



## Challenges of Modeling Ocean Basin Ecosystems

Brad deYoung,<sup>1\*</sup> Mike Heath,<sup>2</sup> Francisco Werner,<sup>3</sup> Fei Chai,<sup>4</sup> Bernard Megrey,<sup>5</sup> Patrick Monfray<sup>6</sup>

With increasing pressure for a more ecological approach to marine fisheries and environmental management, there is a growing need to understand and predict changes in marine ecosystems. Biogeochemical and physical oceanographic models are well developed, but extending these further up the food web to include zooplankton and fish is a major challenge. The difficulty arises because organisms at higher trophic levels are longer lived, with important variability in abundance and distribution at basin and decadal scales. Those organisms at higher trophic levels also have complex life histories compared to microbes, further complicating their coupling to lower trophic levels and the physical system. We discuss a strategy that builds on recent advances in modeling and observations and suggest a way forward that includes approaches to coupling across trophic levels and the inclusion of uncertainty.

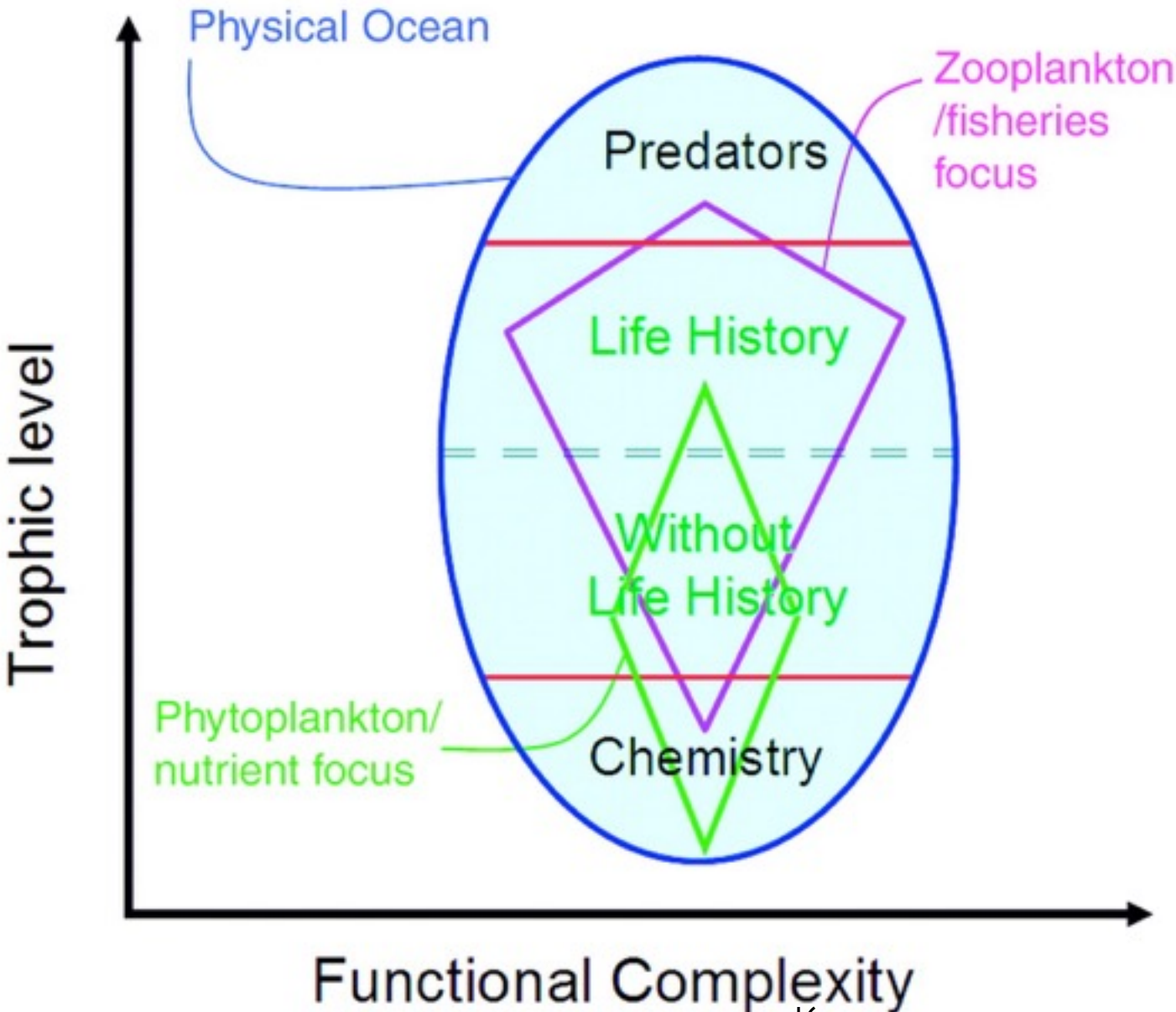


deYoung, Heath,  
Werner, Chai,  
Megrey, Monfray

*Science*, 2004

The difficulty arises because organisms at higher trophic levels are longer lived, with important variability in abundance and distribution at basin and decadal scales.

# Rhomboid Approach



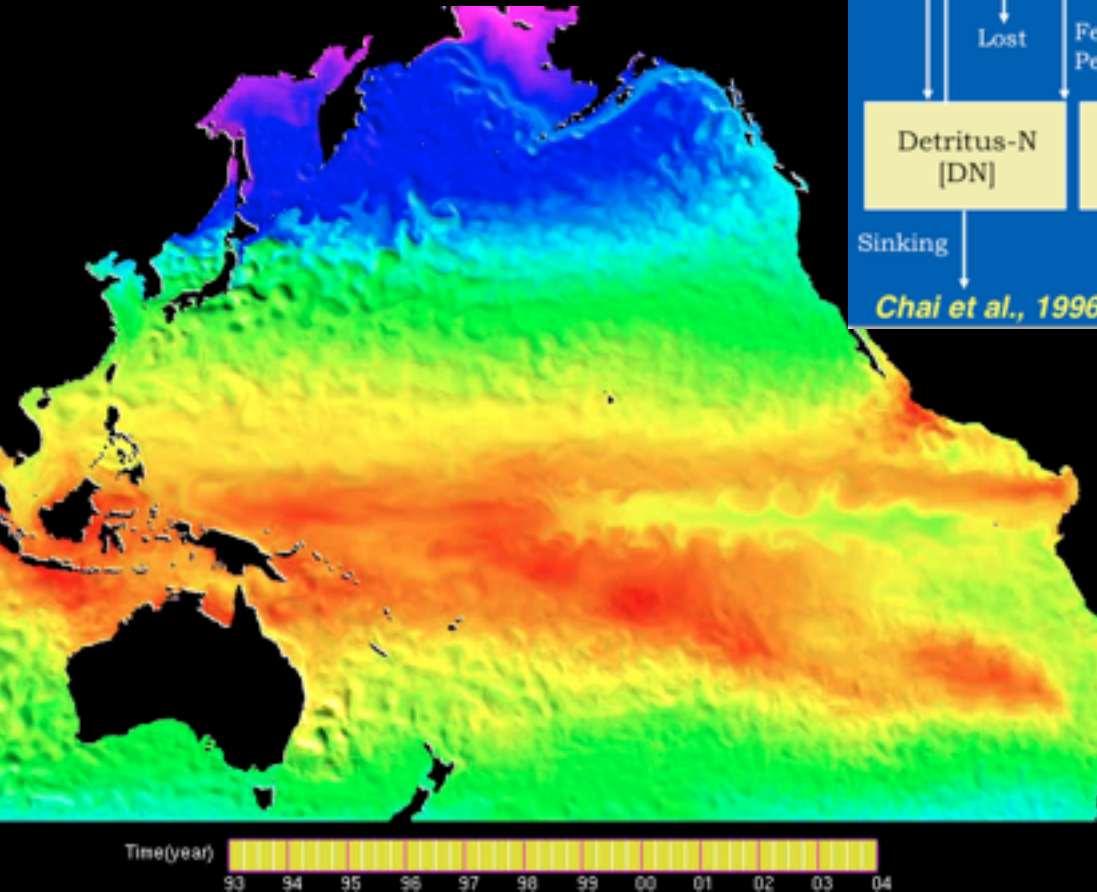
The rhomboids indicate the conceptual characteristics for models with different species and differing areas of primary focus.

Rhomboid is broadest where model has its greatest functional complexity i.e., at the level of the target organism.

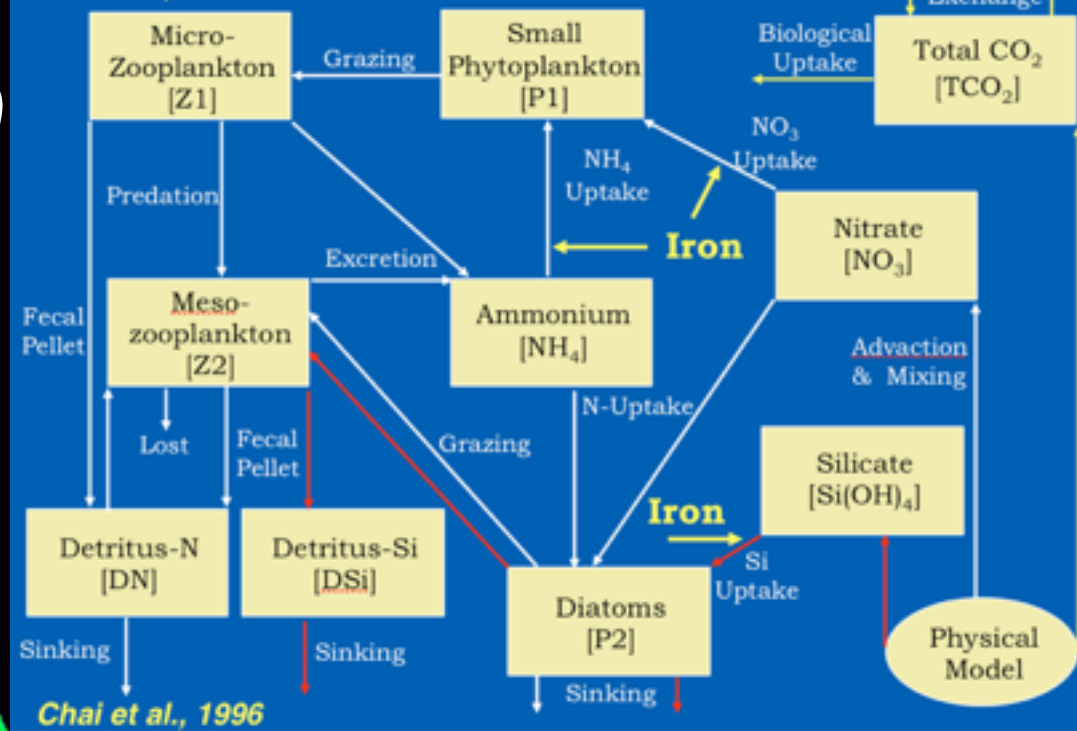
deYoung, Heath, Werner, Chai, Megrey, Monfray  
*Science*, 2004



# Regional Ocean Model System (ROMS) 1/8 deg. (7-12km) (1990 to 2018)



Carbon, Silicate, Nitrogen Ecosystem Model  
CoSiNE, Chai et al. 2002



## Carbon, Silicate, Nitrogen Ecosystem Model (CoSiNE)

(Chai et al., 2002, 2003, 2007, 2009; Fujii and Chai, 2007; Liu and Chai, 2009; Xiu and Chai, 2011, Palacz et al., 2011, Xu et al., 2013, Xiu and Chai, 2013, 2014, Guo et al., 2014; 2015; Zhou et al., 2017; Liu et al., 2018; Xiu and Chai et al., 2018)

1990

2008

1990

2008

EOF

Mode I

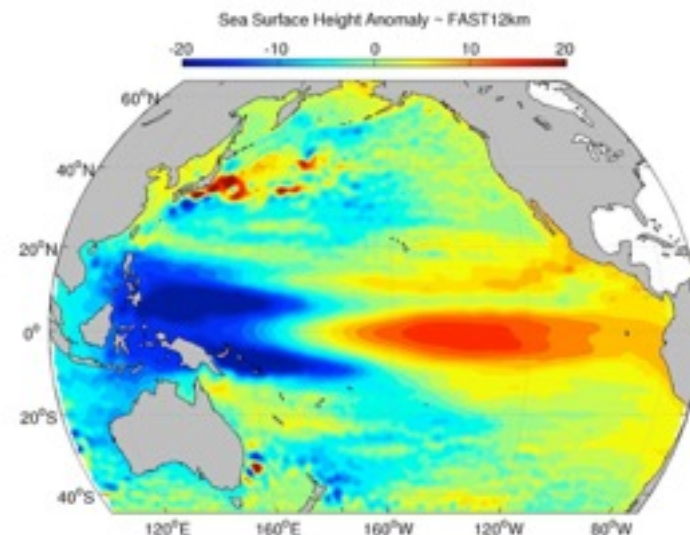
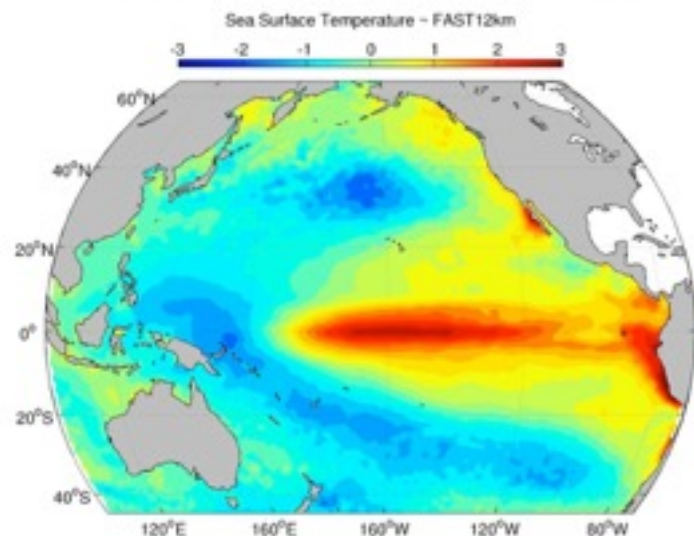
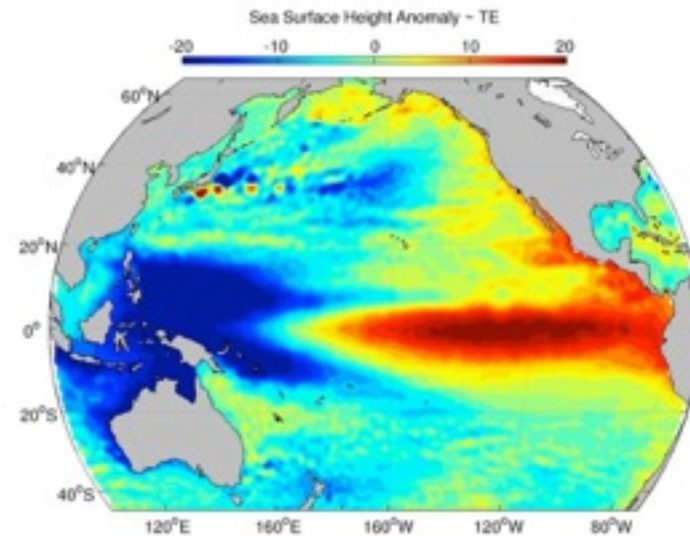
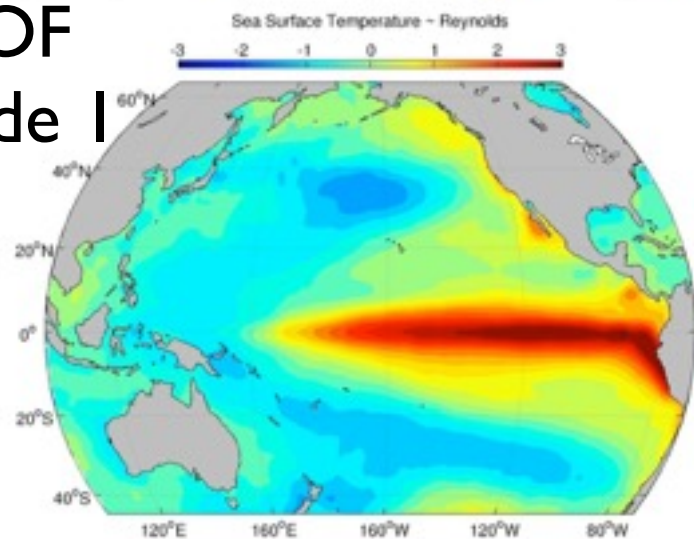
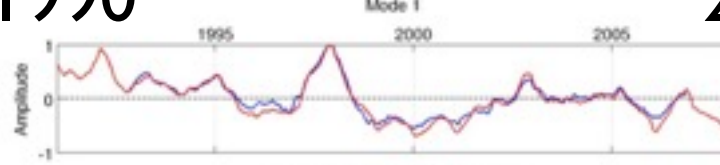
Data

Model

SST

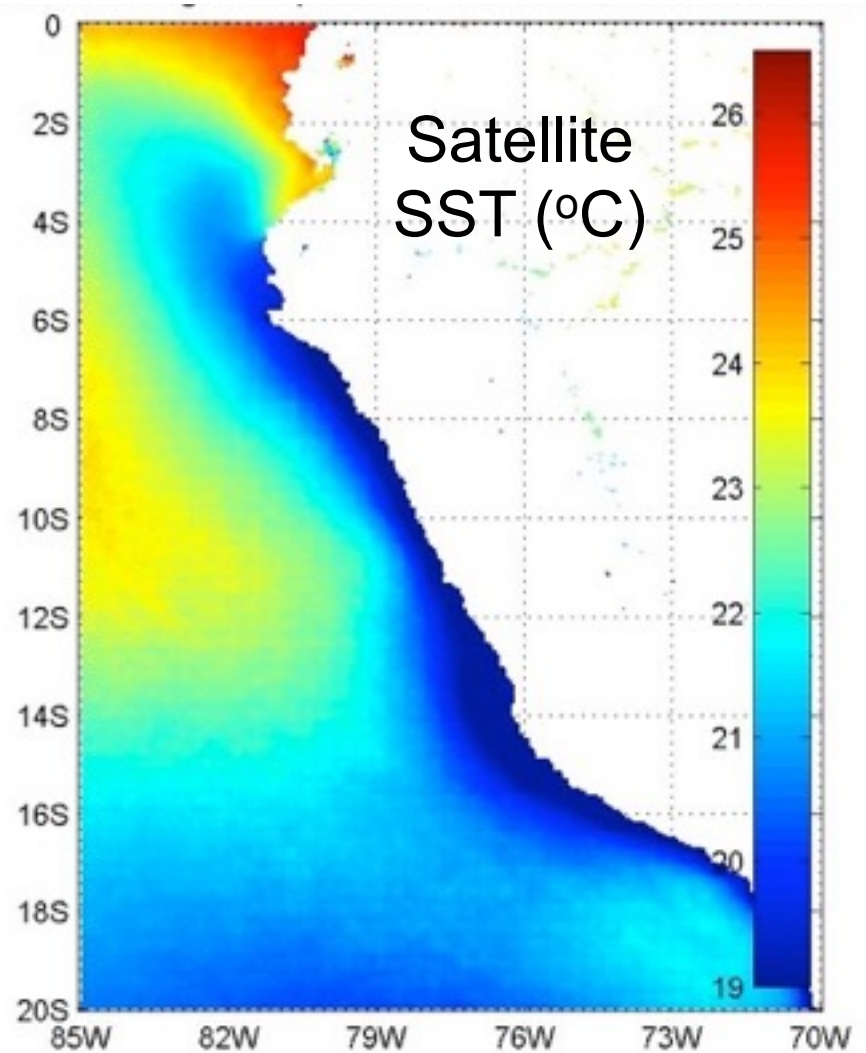
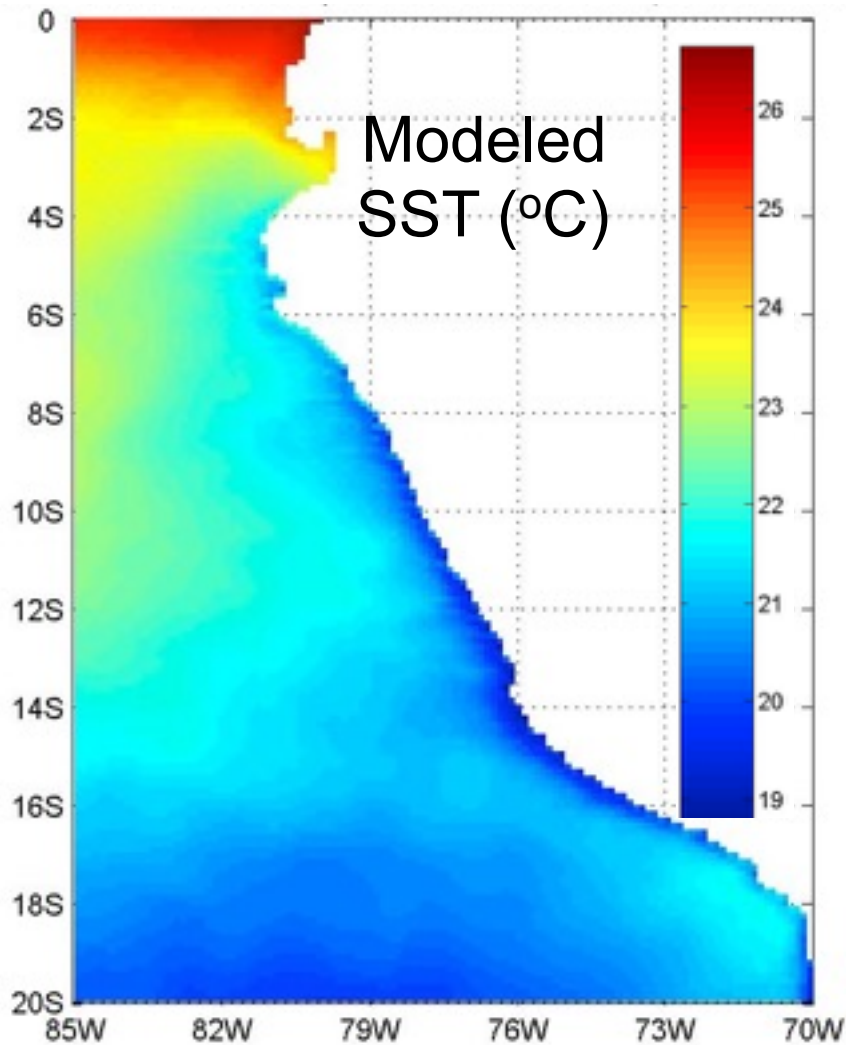
Zhang et al.,  
2017, JGR

Sea level (SSHA)



# Pacific Basin ROMS-CoSINE (12-km) Simulation

## Annual Mean Sea Surface Temperature (SST)

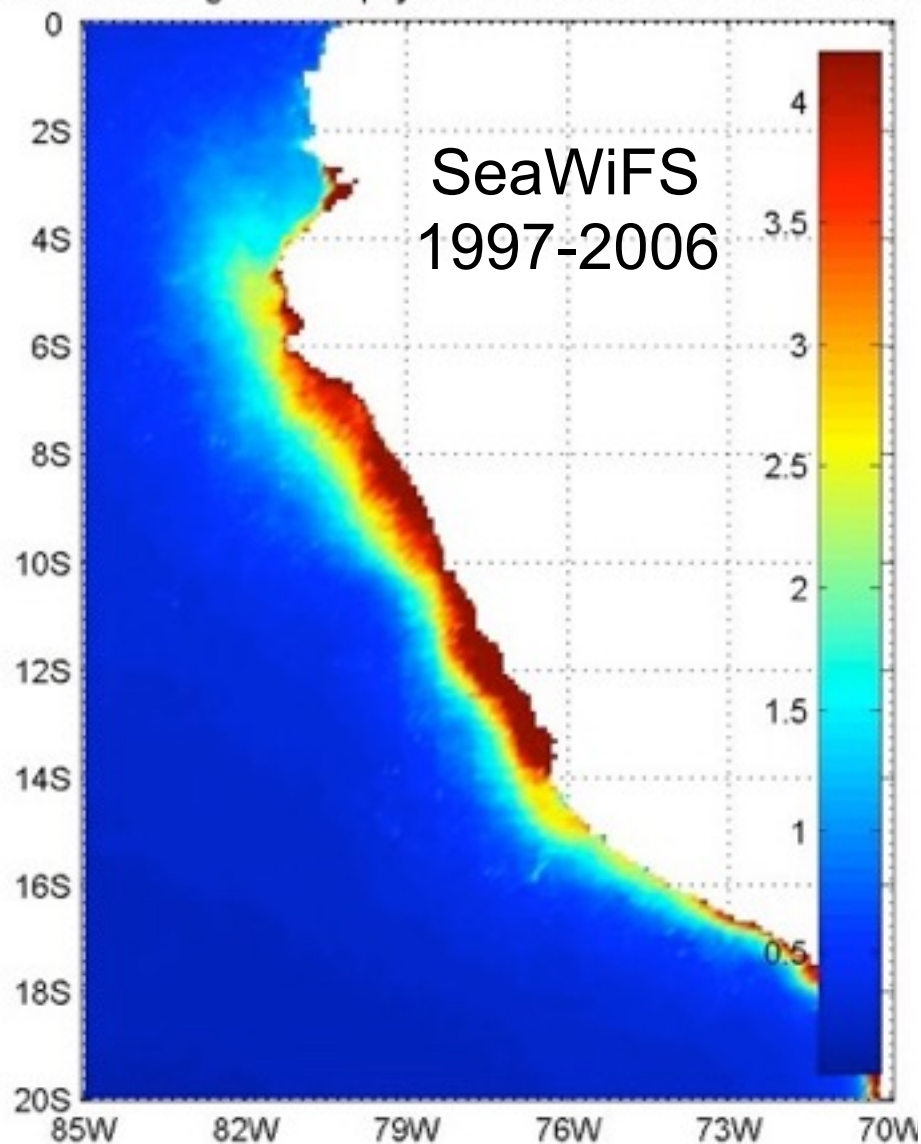




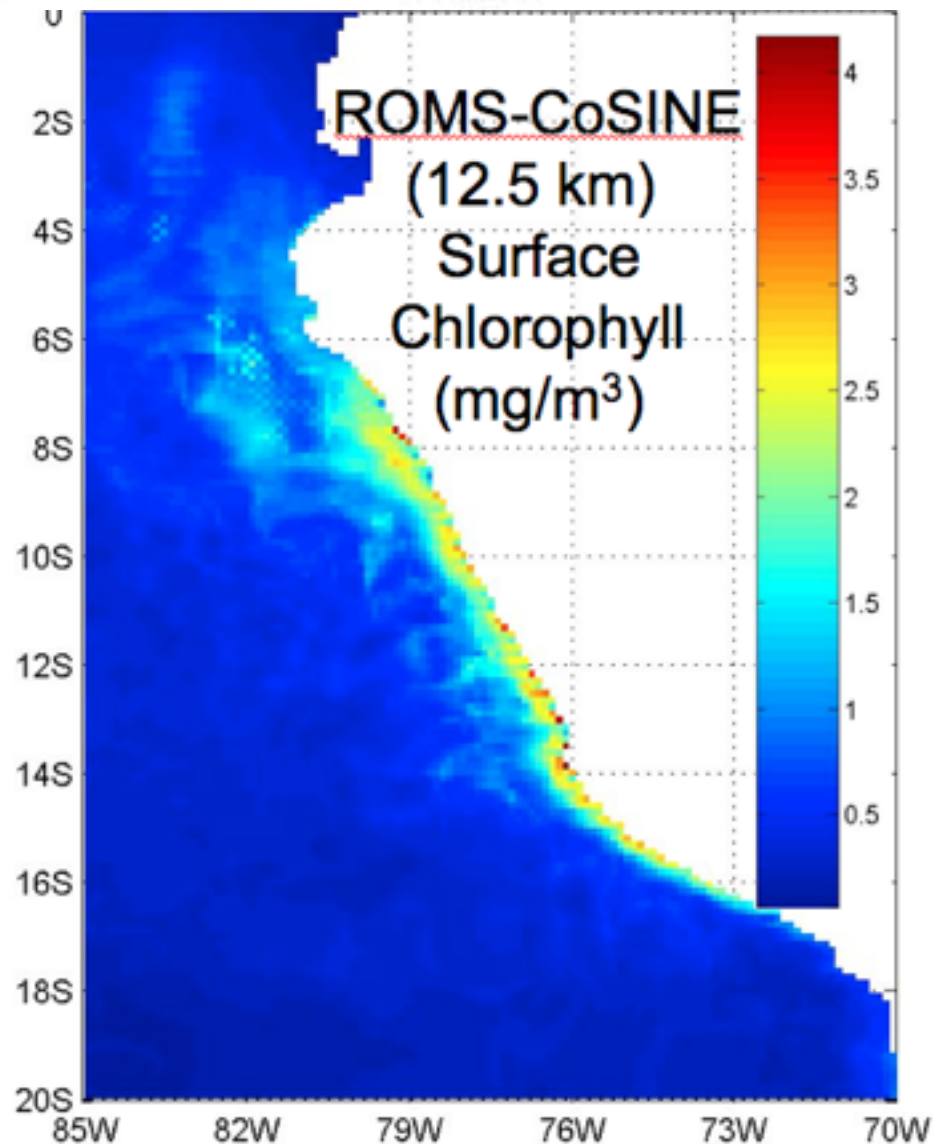
# Surfare Chlorophyll Comparison

*in situ*, the modeled, and SeaWiFS

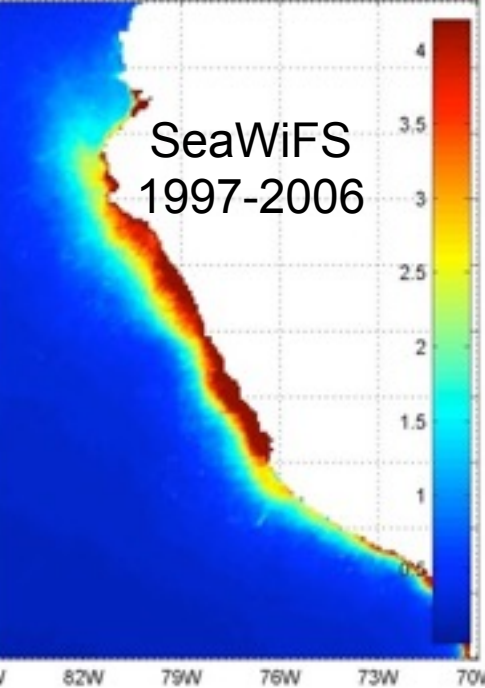
Satellite Averaged Chlorophyll of Year 1997-2006 for Coastal Peru



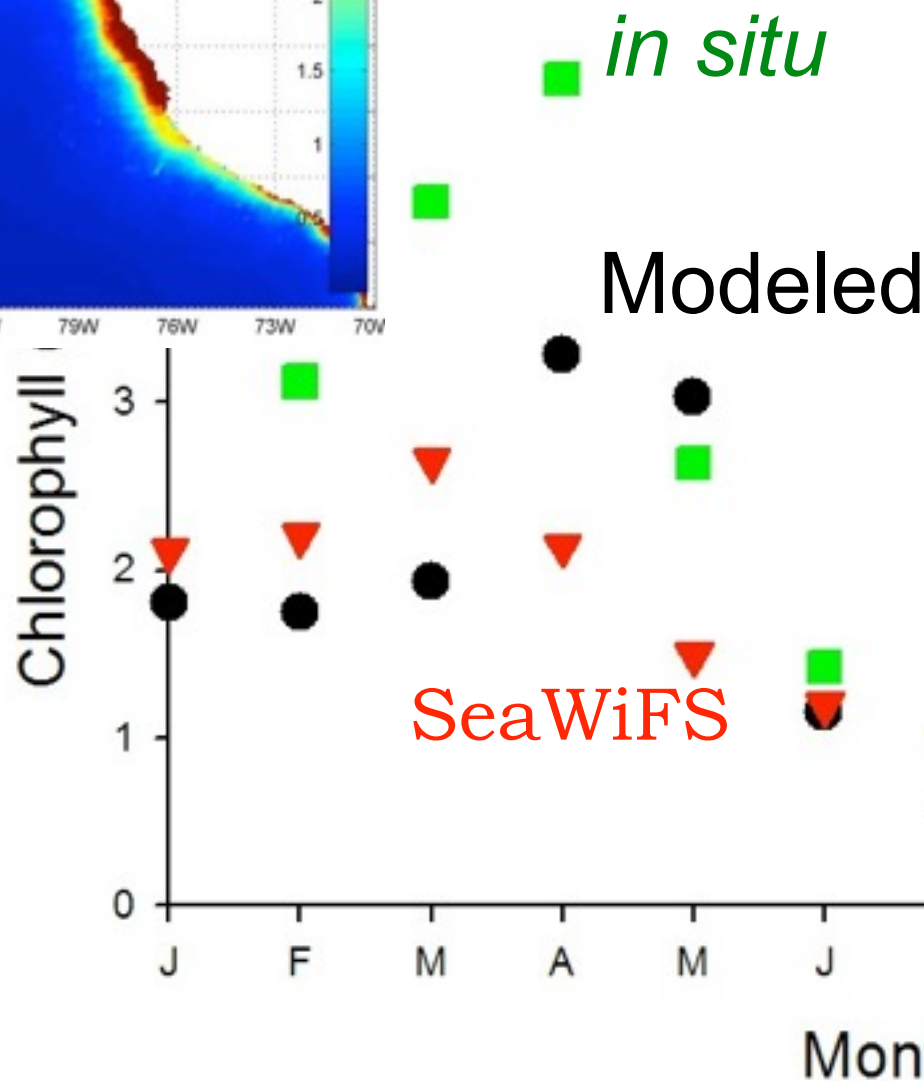
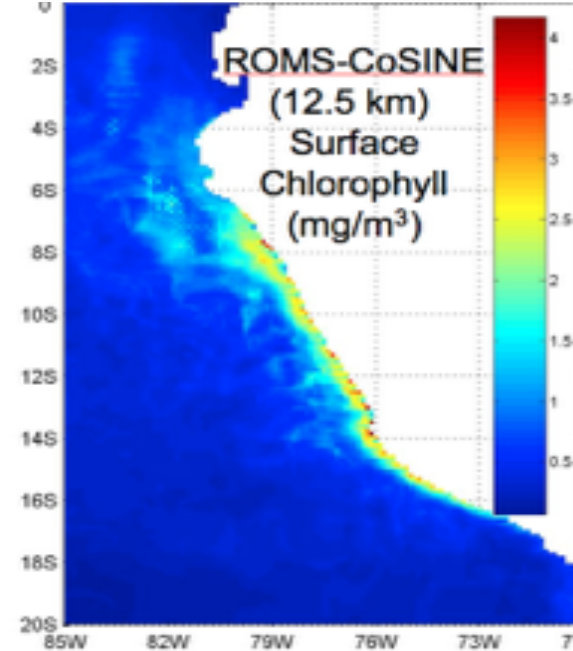
1953:2001



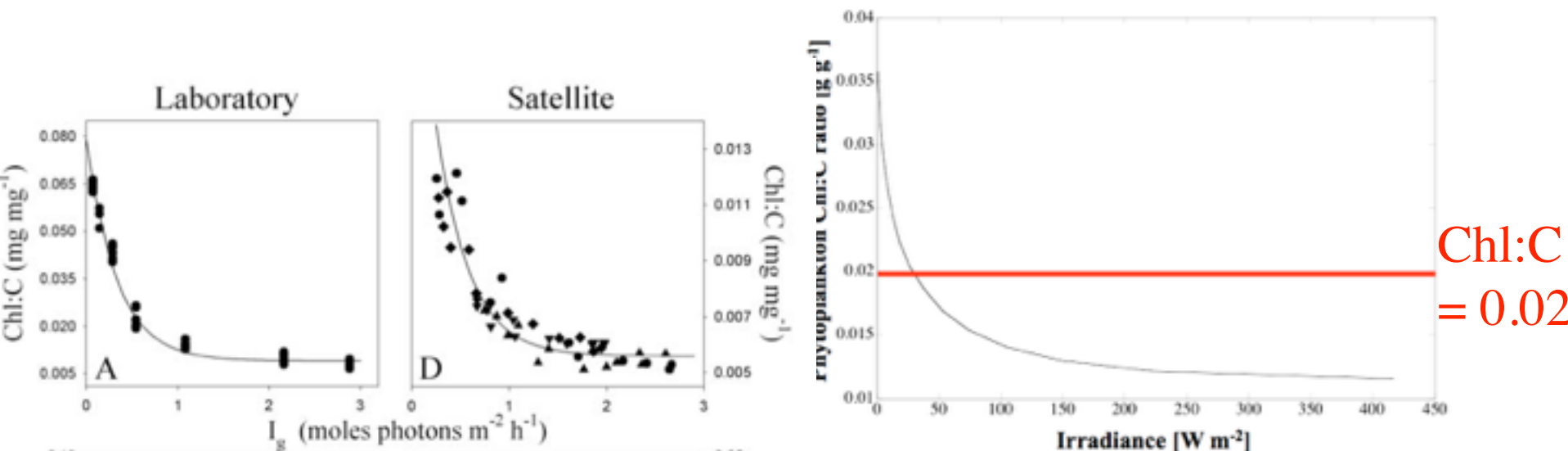
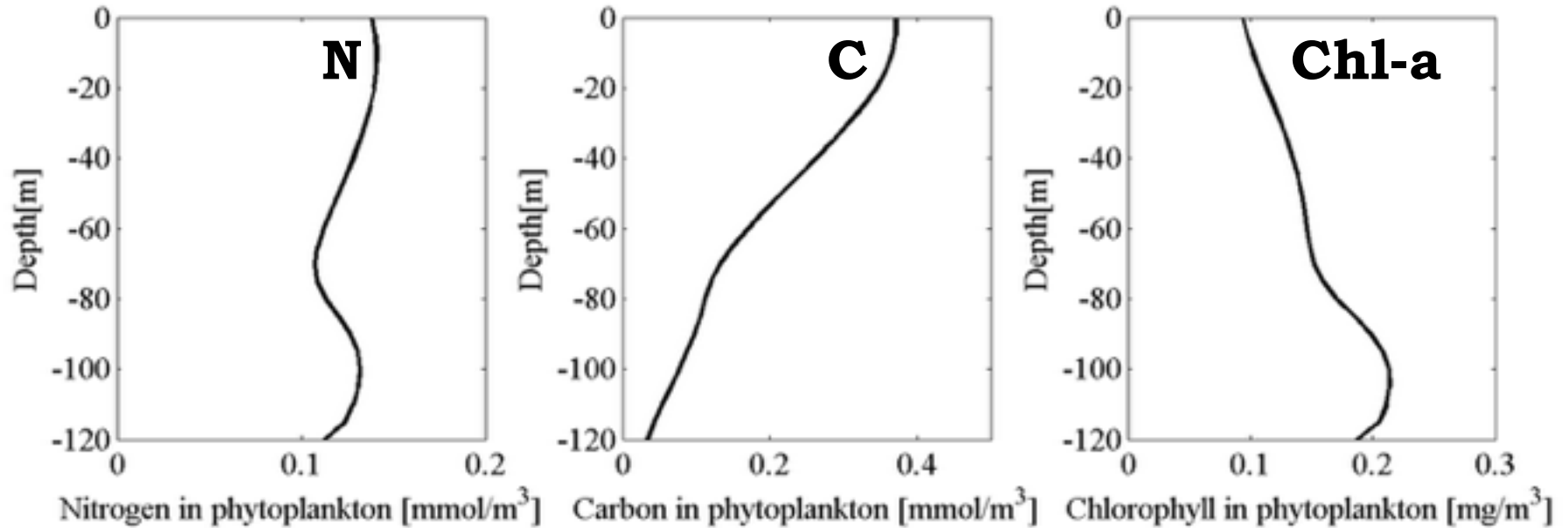




# Map of Surface Chlorophyll off Peru, 0-100km, 4°S-18°S

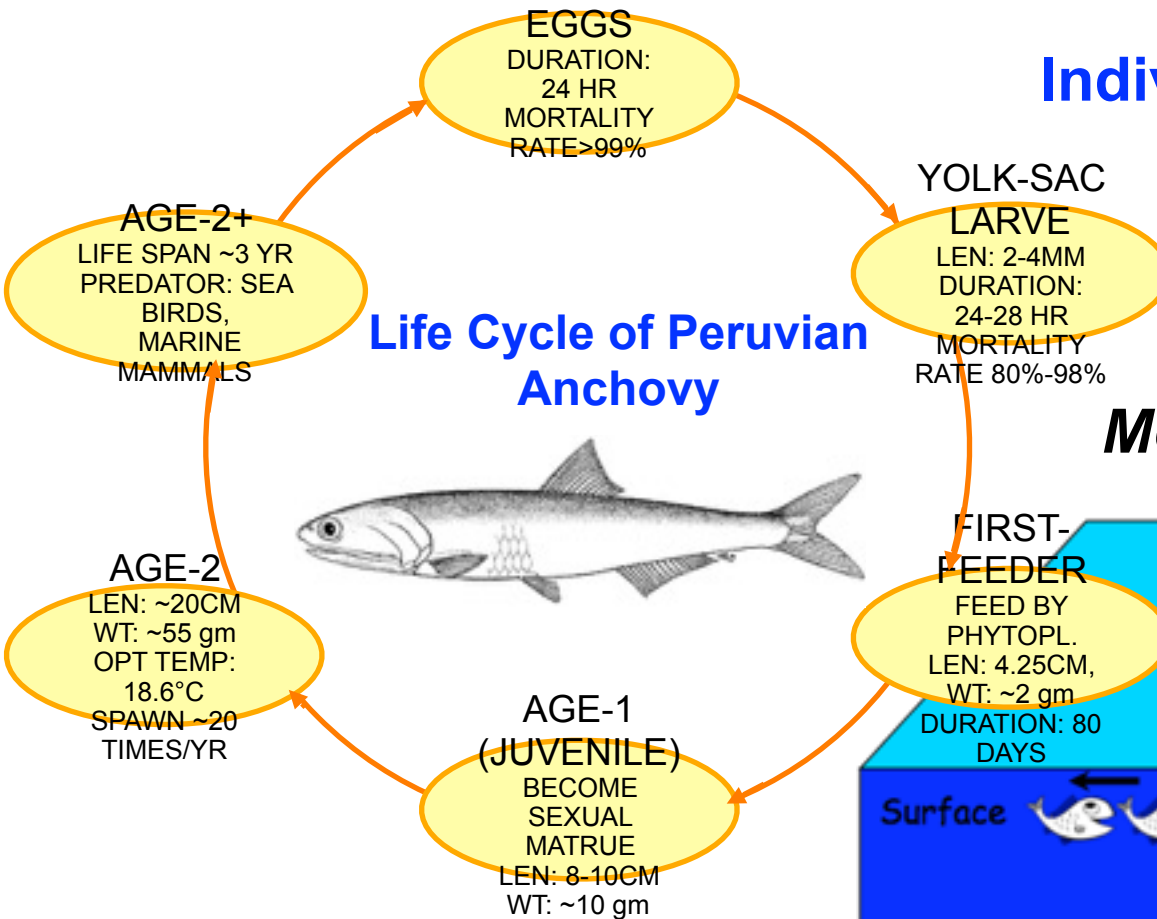


# Variable ratios of N, C, and Chl-a Model

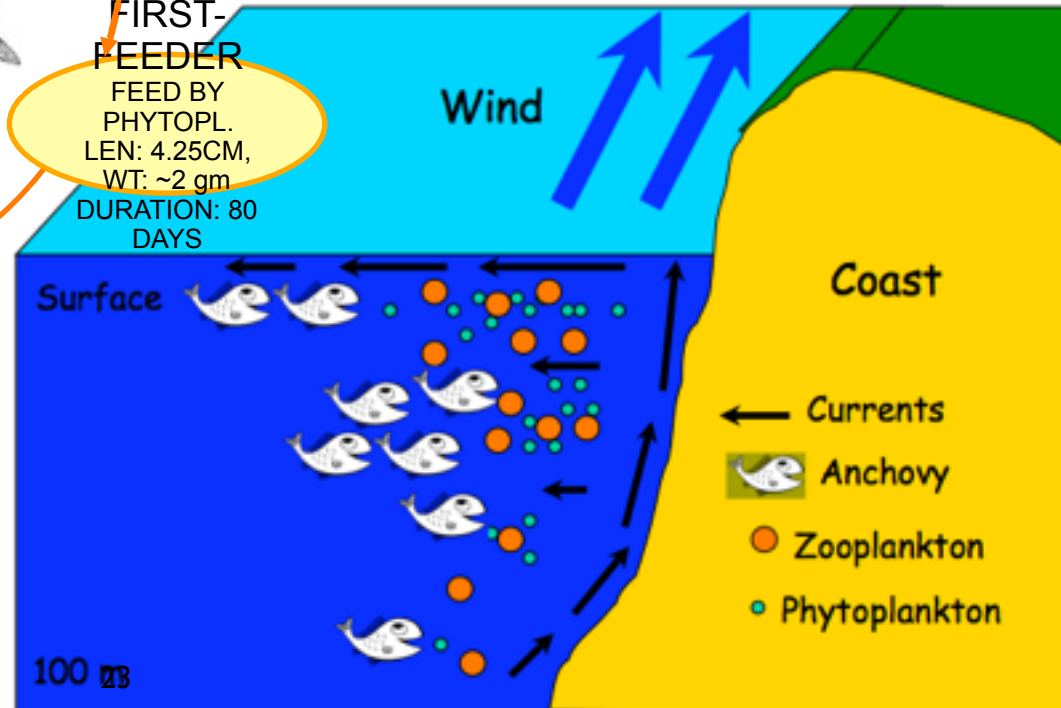


# Current, Food, Temperature Output from ROMS-CoSiNE

## Individual Based Model (IBM)



*Modeling one fish at a time*



# Individual Based Model

Movement - a 3D Lagrangian particle tracking algorithm

$$\frac{d\vec{x}}{dt} = \vec{v}(\vec{x}, t) + \vec{S}(\vec{x}, t)$$

drifting swimming

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Bioenergetic – life history (size specific  
growth, mortality, reproduction, ...)



# Individual Based Model

## Offline

- Sensitivity runs
- No feedback to planktons

Good for model development!

## Online

- Biological attributes/ behaviors need to be specified a priori
- Allow feedbacks to planktons

**There are existing codes coupled with ROMS.**

# 3-D ROMS-CoSiNE-IBM (1991-2007)

Fishery Location: Peruvian waters, Chimbote.

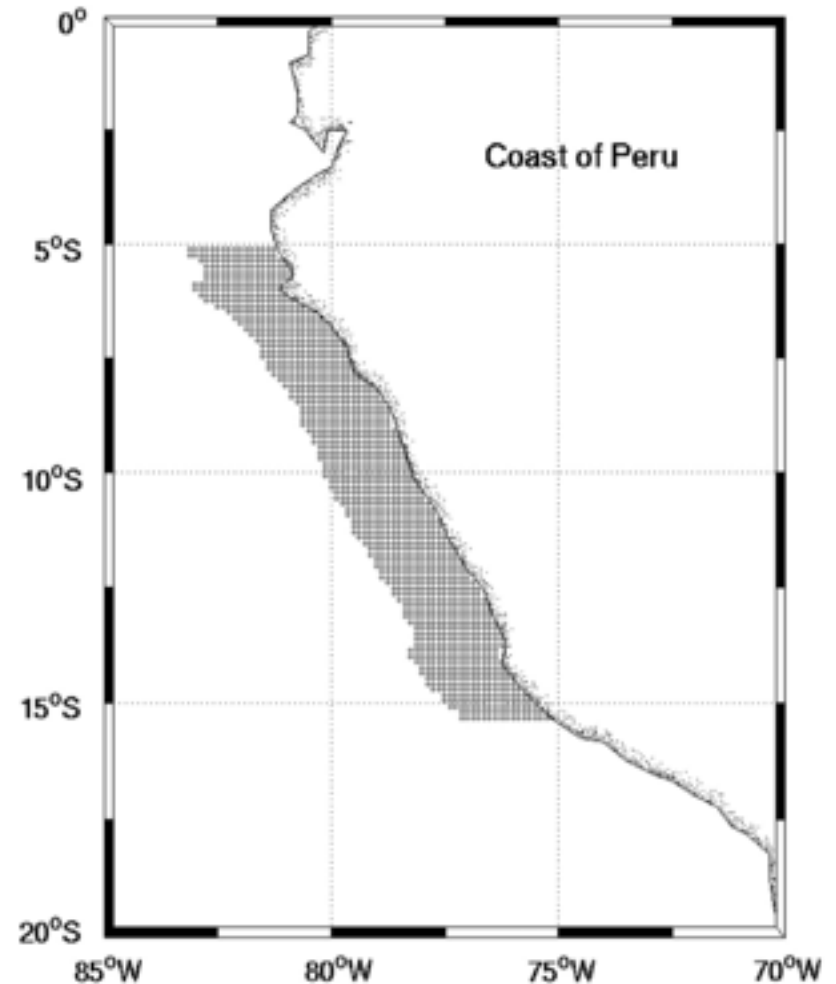
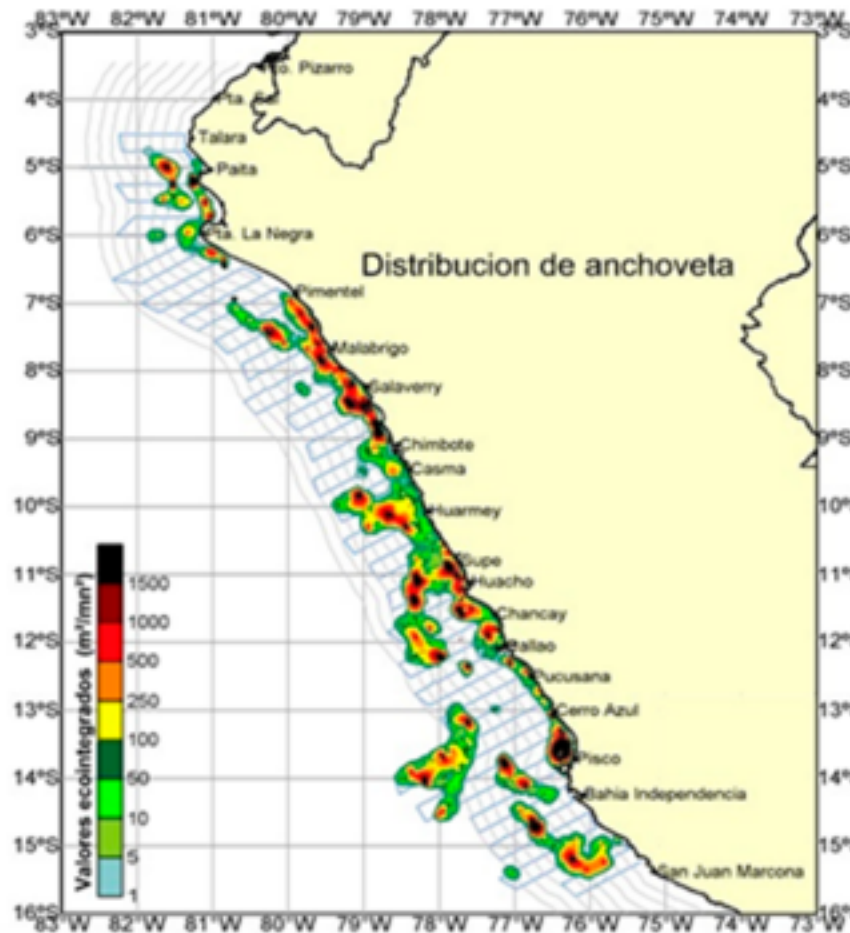
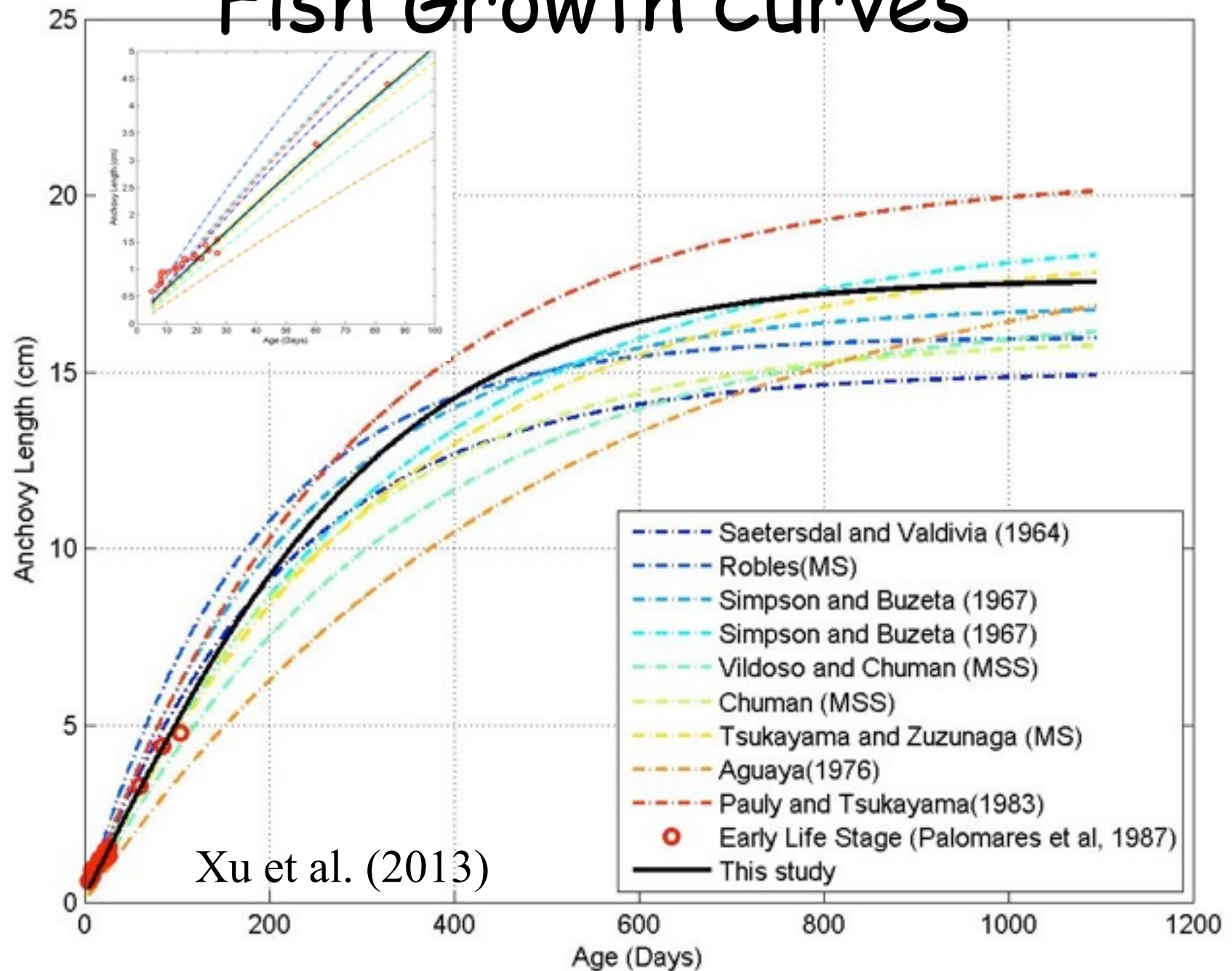


Fig. 1. The portion of the ROMS model grid (45°S to 65°N) used for the IBM grid (entire box), and the smaller area used to start super-individuals for the 3-D version and to average results for input to the 0-D version (shaded area).

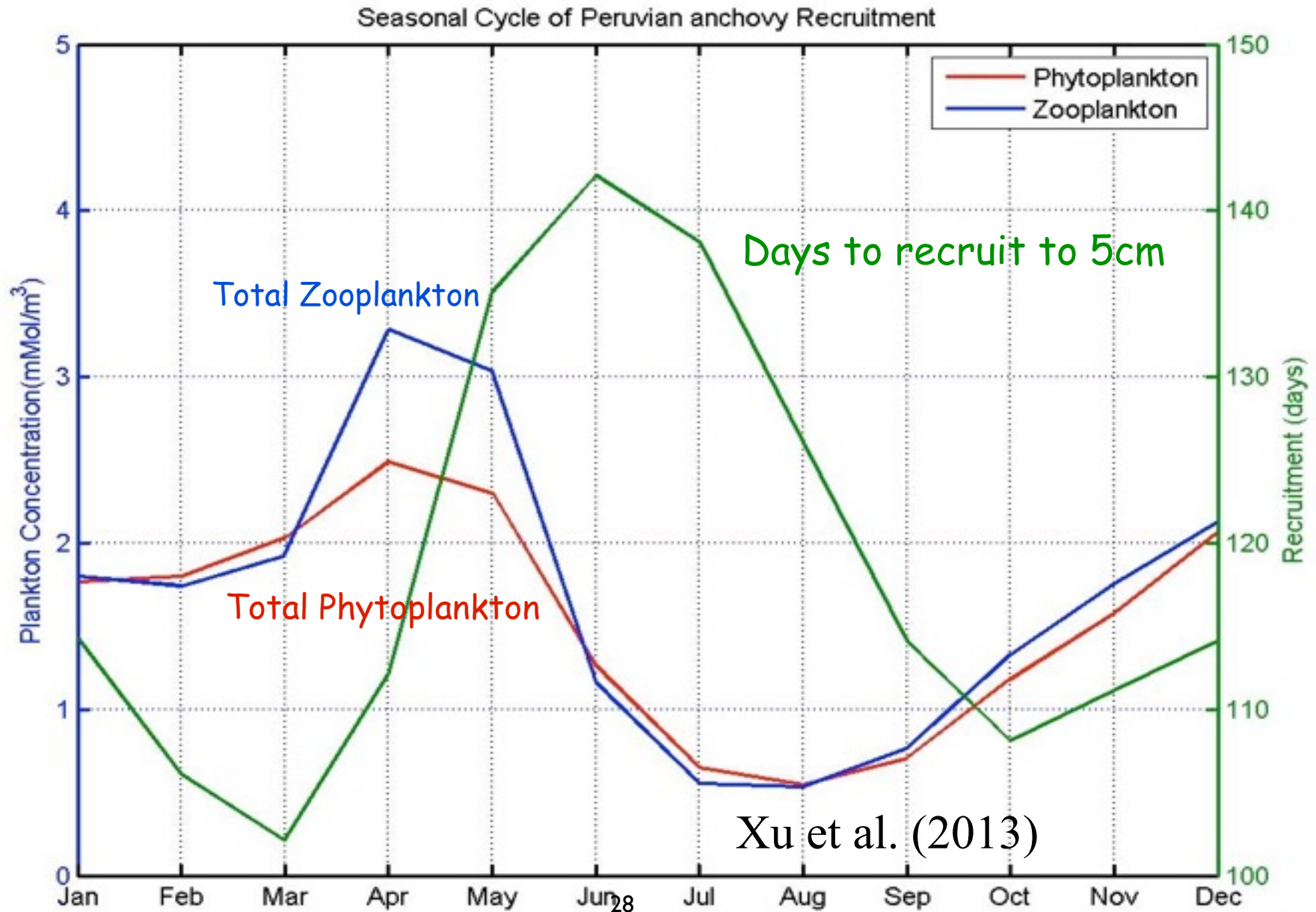
# Fish Growth Curves



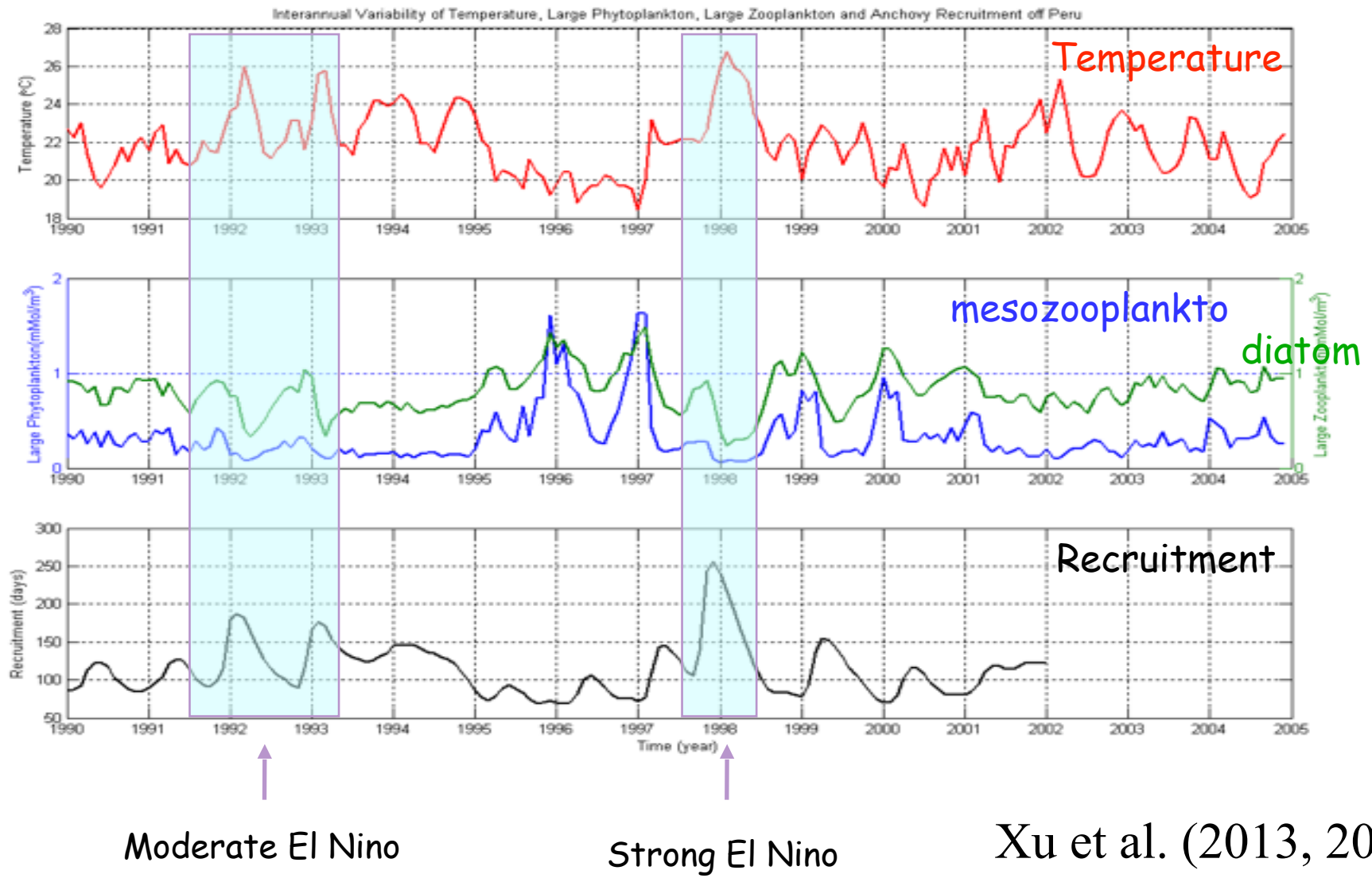
Xu et al. (2013)



# Recruitment: Seasonal Cycle

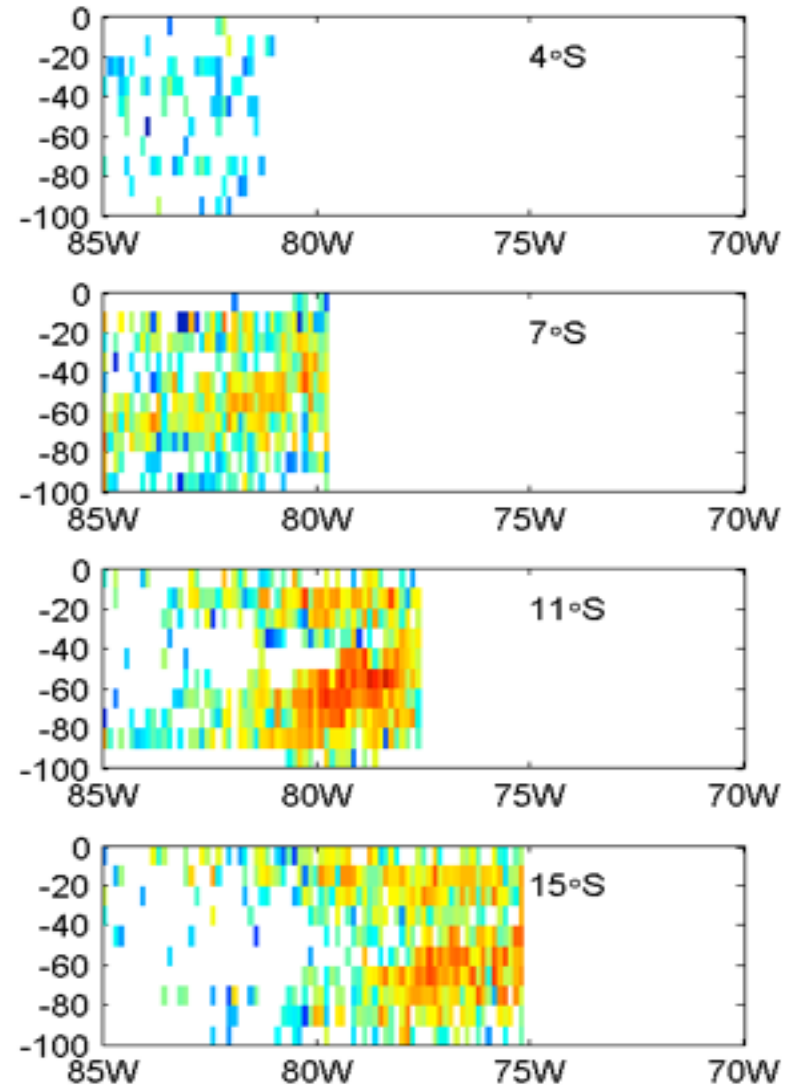
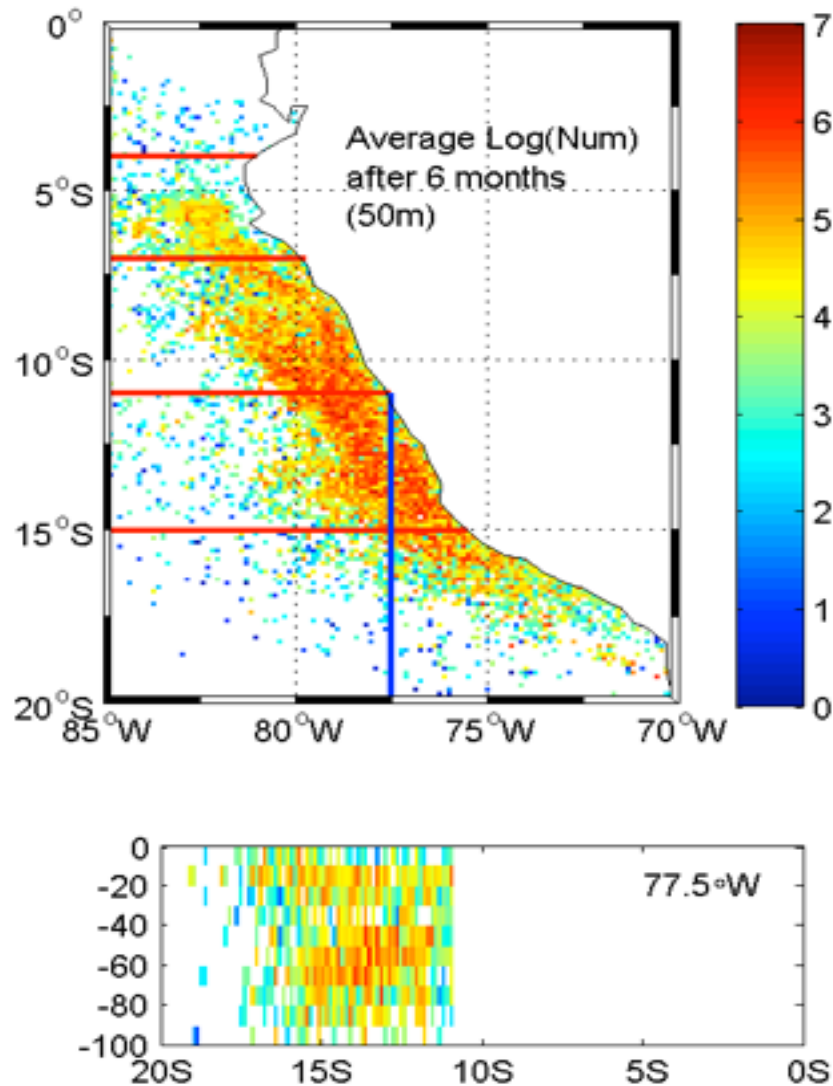


# Anchovy Recruitment in Response to ENSO



There is a clear seasonal and interannual variability  
29 characterized by anchovy recruitment to 5cm.

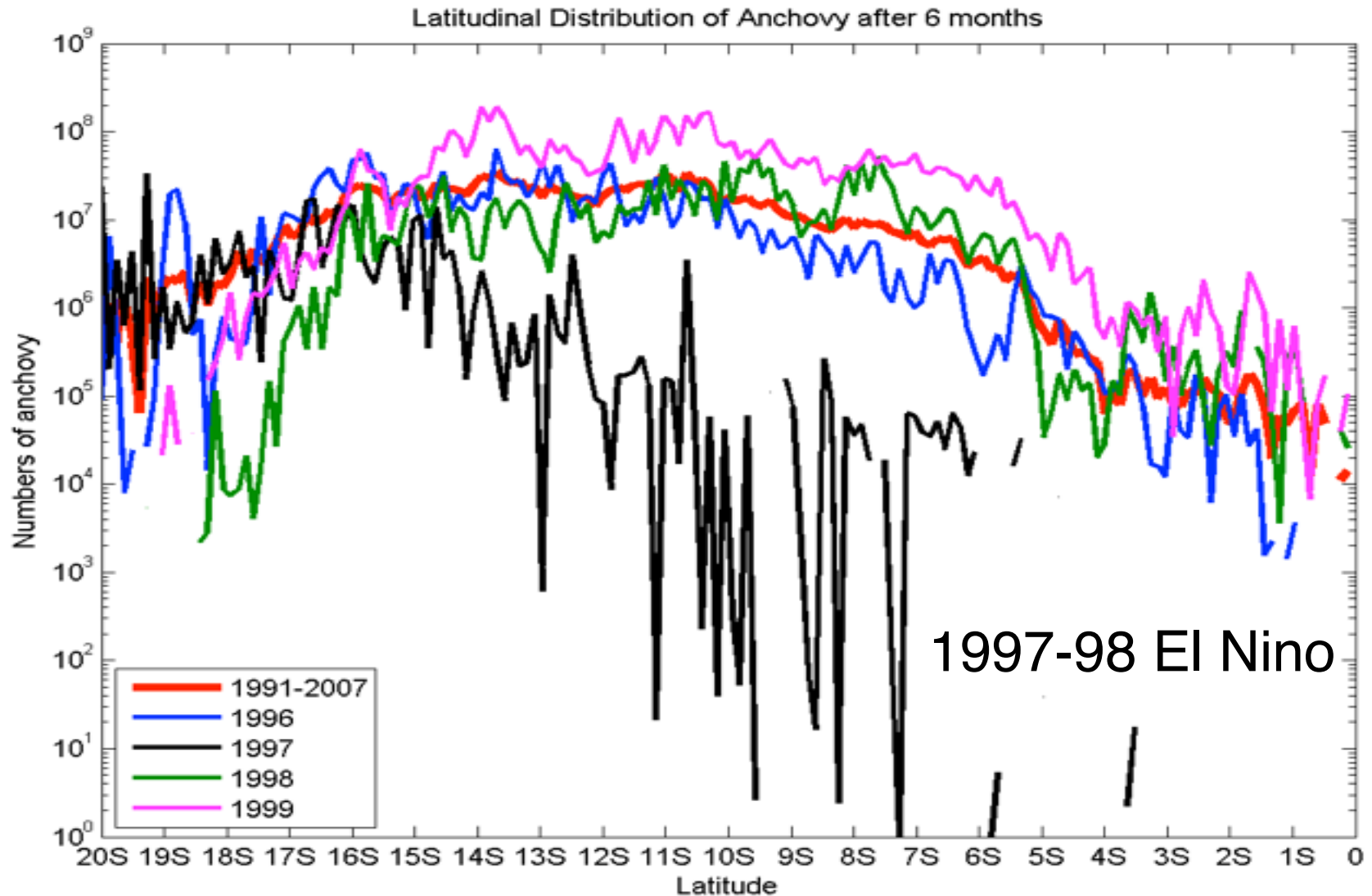
# Anchovy Distribution - Mean Conditions



Xu and Chai, et al. (2013, Ecological Modeling;)

Averaged from 1991-2007

# Latitudinal distribution of Anchovy



Xu and Chai, et al. (2013, Ecological Modeling)



# 0-D vs. 3-D results comparison

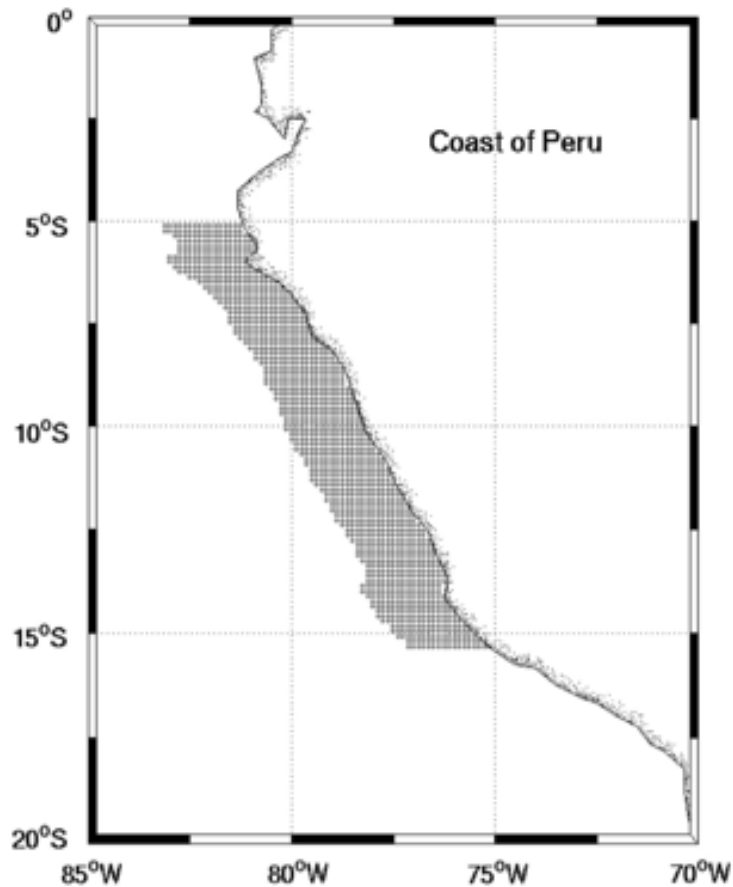


Fig. 1. The portion of the ROMS model grid (45°S to 65°N) used for the IBM grid (entire box), and the smaller area used to start super-individuals for the 3-D version and to average results for input to the 0-D version (shaded area).

0-D model means no movement and behavior, all the fish experience the same temperature and food

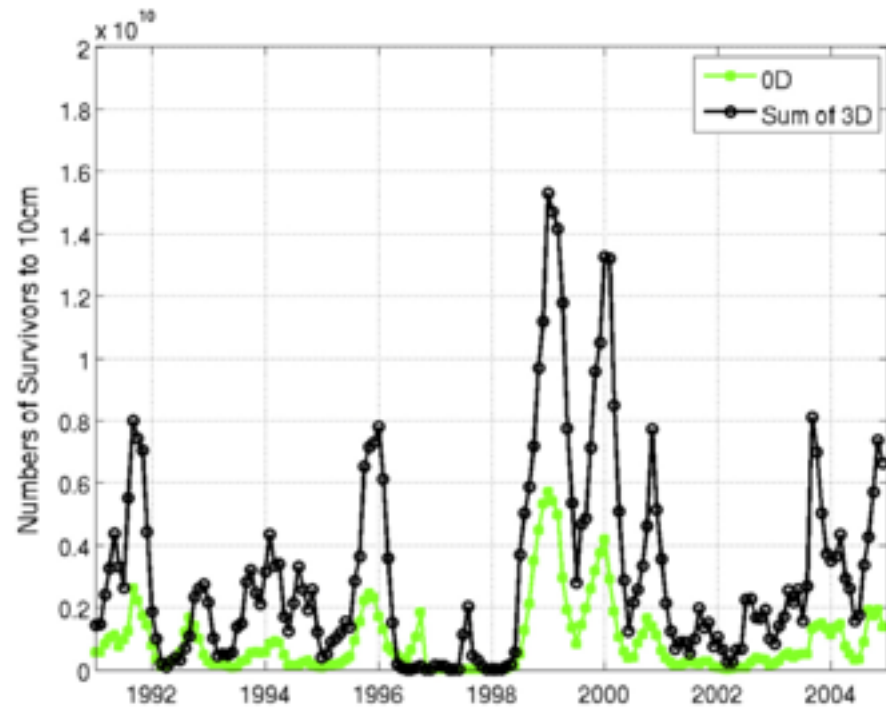
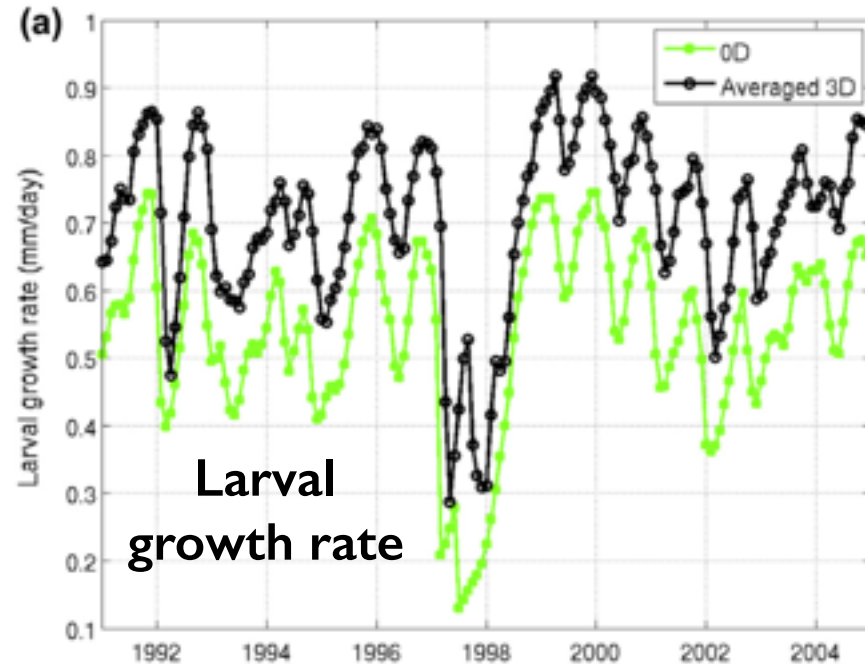
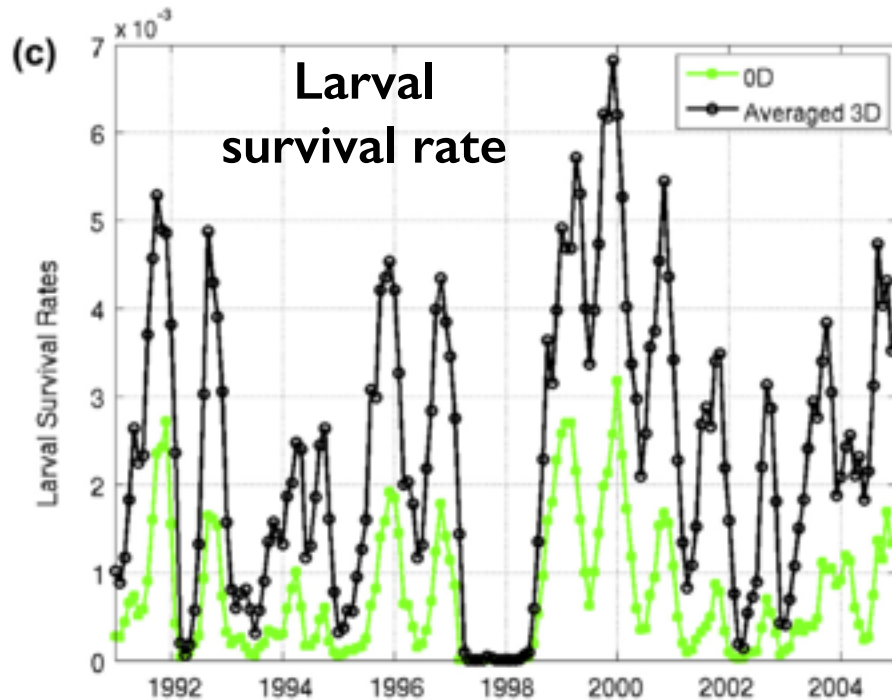


Fig. 6. Recruitment (number surviving to 10 cm) of anchovy for each year-month simulation for the 3-D and 0-D versions of the model.

# 0-D vs. 3-D results comparison

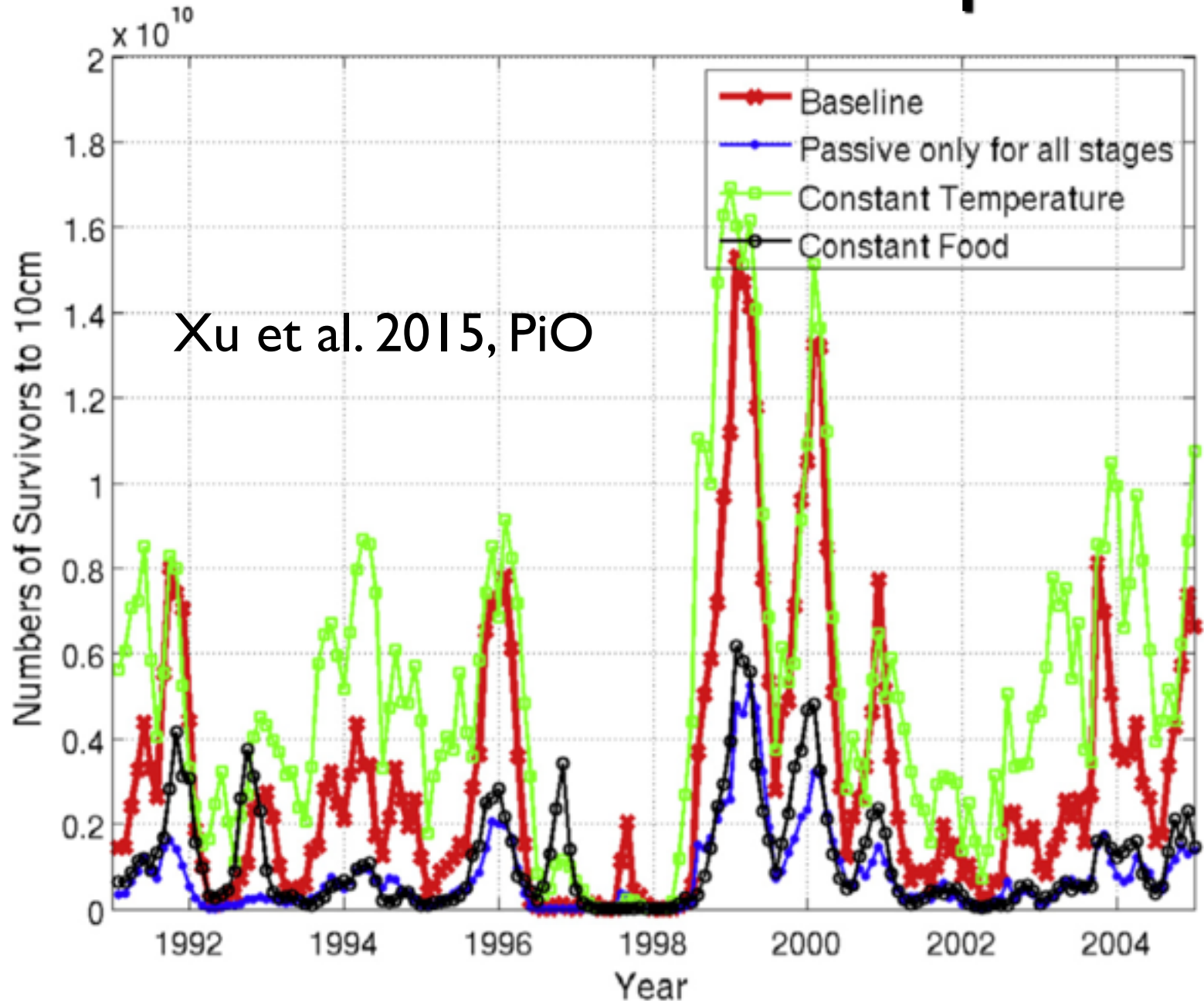
Larval (5-45mm) are mainly following the flow (i.e. currents), but also actively searching/moving for better conditions.



3-D results are better, moving around is good for the young fish.

Xu et al. (2015 Progress in Oceanography)

# 0-D vs. 3-D results comparison



# End-to-End Modeling for CCS

## Proof of Principle

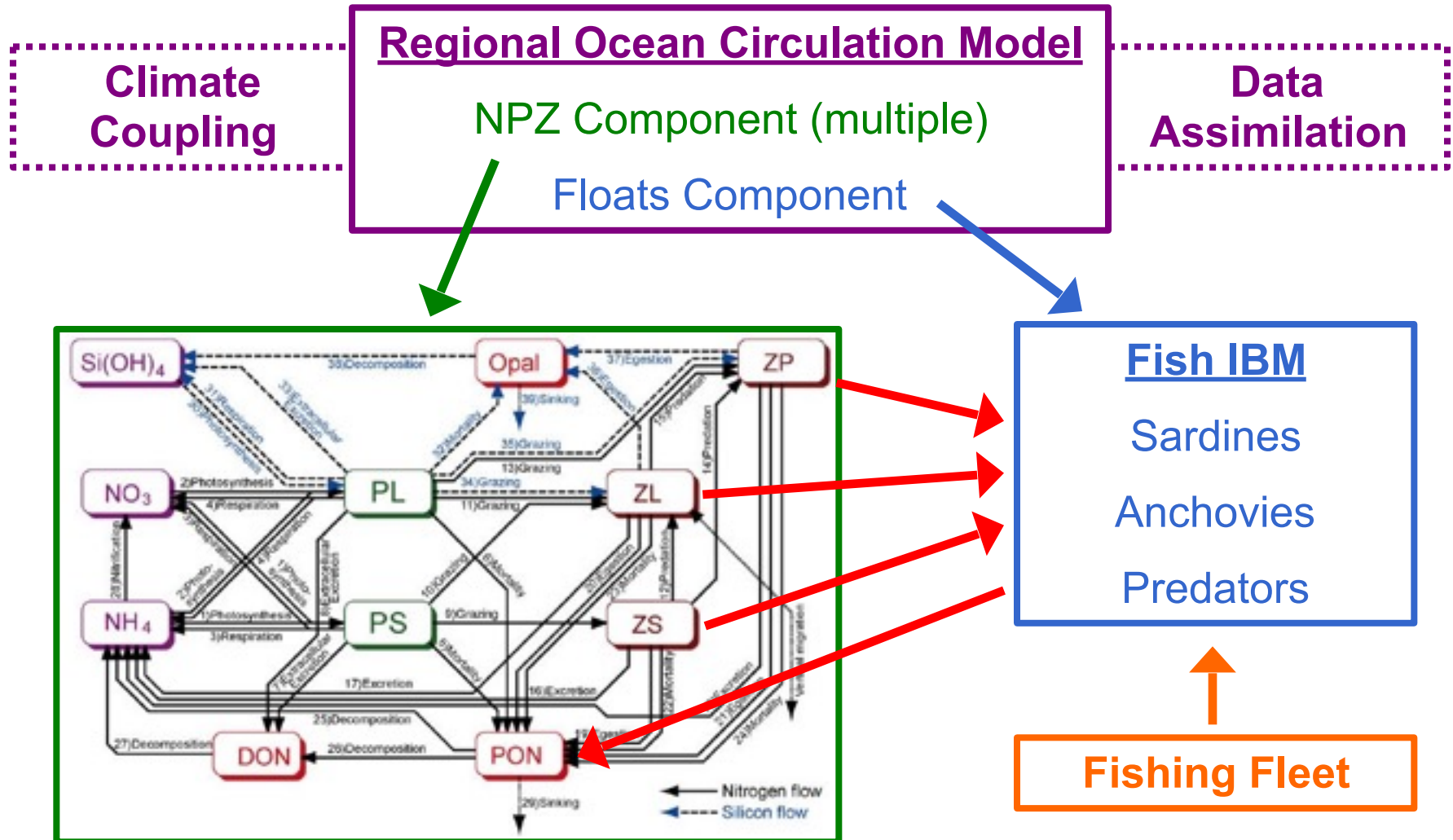
- Sardine – anchovy population cycles
  - Well-studied
  - Teleconnections across basins
- Good case study
  - Forage fish tightly coupled to NPZ
  - Important ecologically and widely distributed
  - Cycles documented in many systems
  - Recent emphasis on spatial aspects of cycles

Rose et al. 2015. Demonstration of a fully-coupled end-to-end model for small pelagic fish using sardine and anchovy in the California Current. *Progress in Oceanography* 138: 348-380.

Fiechter et al. 2015. The role of environmental controls in determining sardine and anchovy population cycles in the California Current: Analysis of an end-to-end model. *Progress in Oceanography* 138: 381-398.



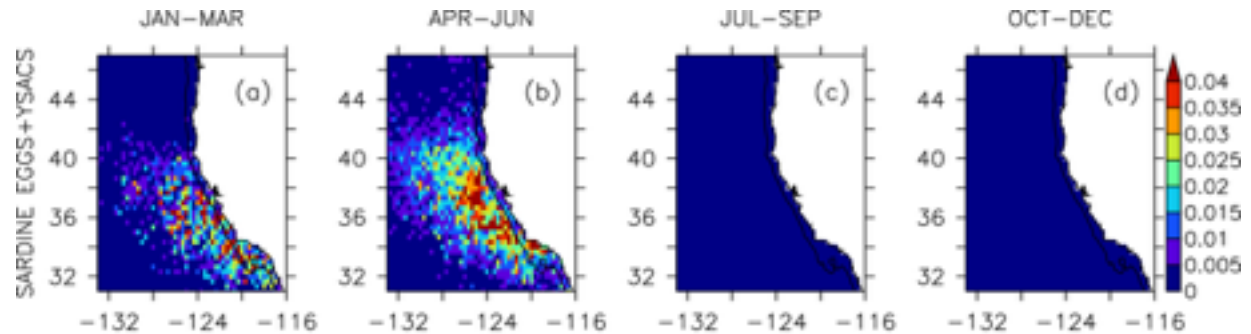
# Fully-Coupled Model Within ROMS



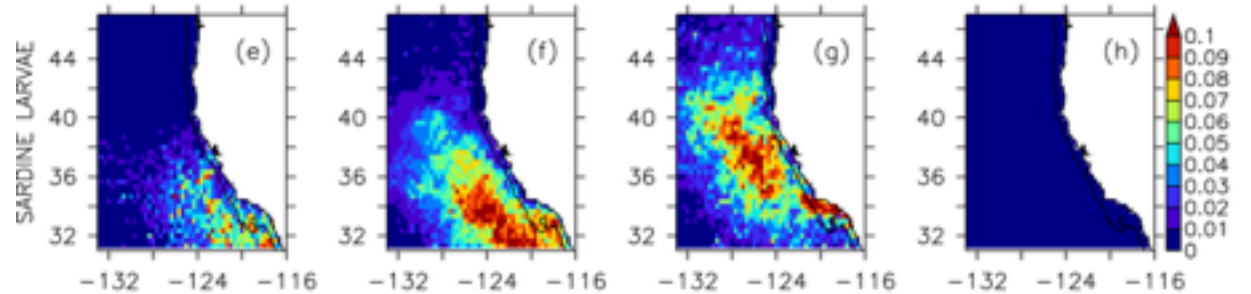
# Sardine Spatial

(E&YS –  $10^{12}$ ; 1000 MT)

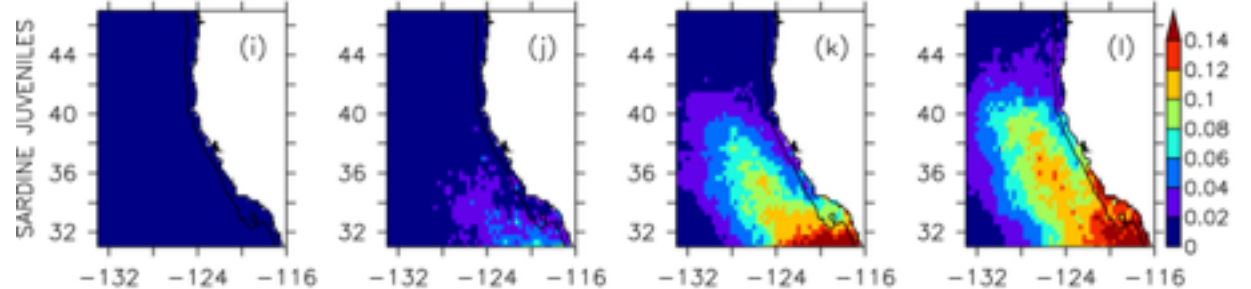
Eggs/  
Yolk-sac



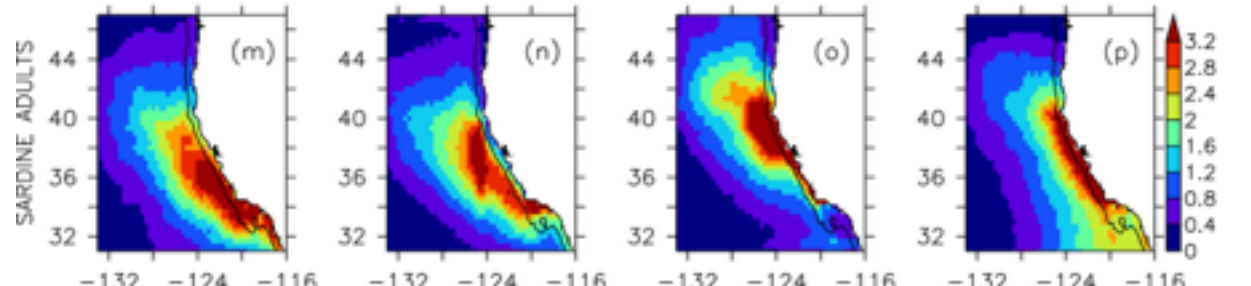
Larvae



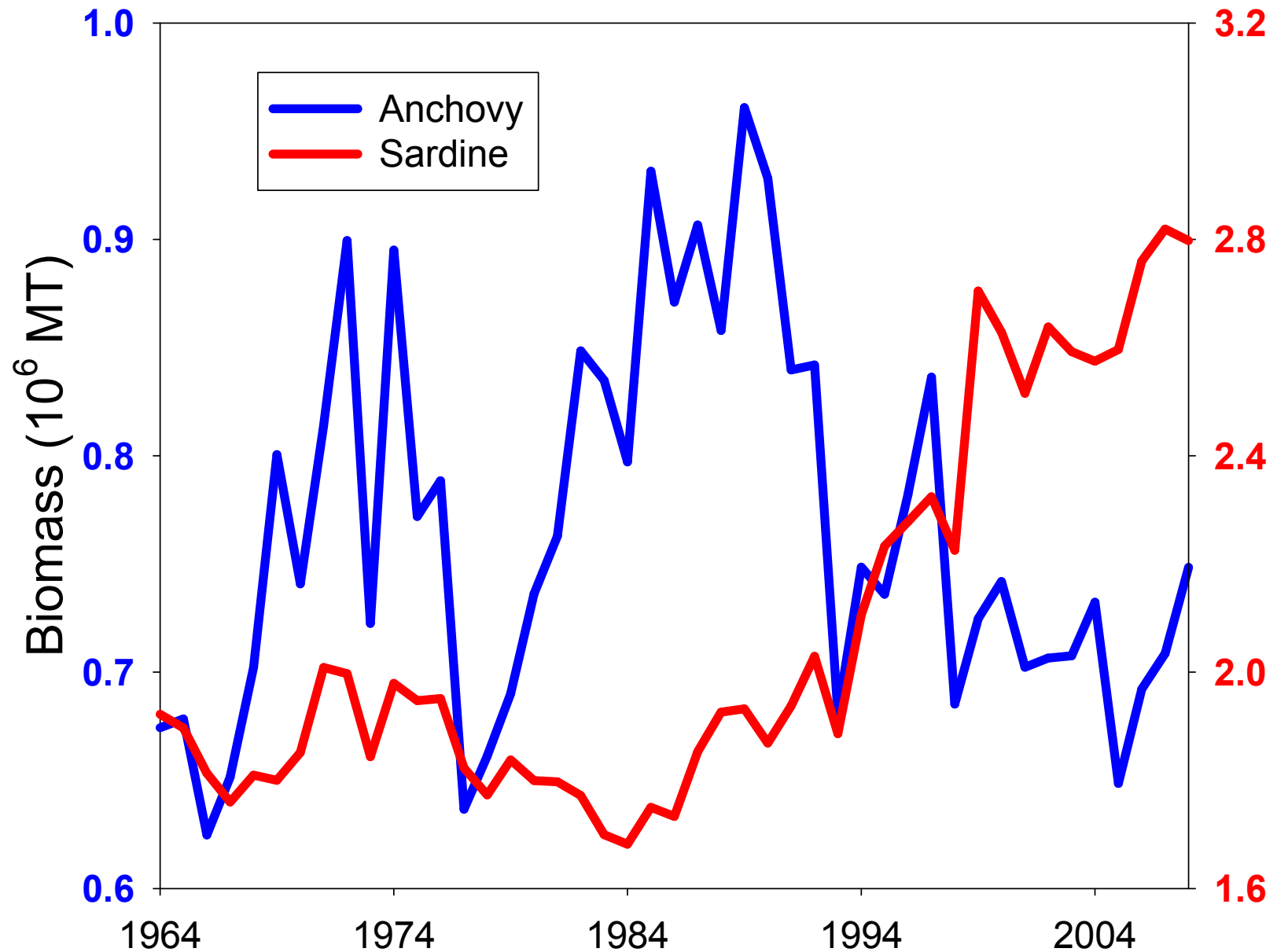
Juveniles



Adults



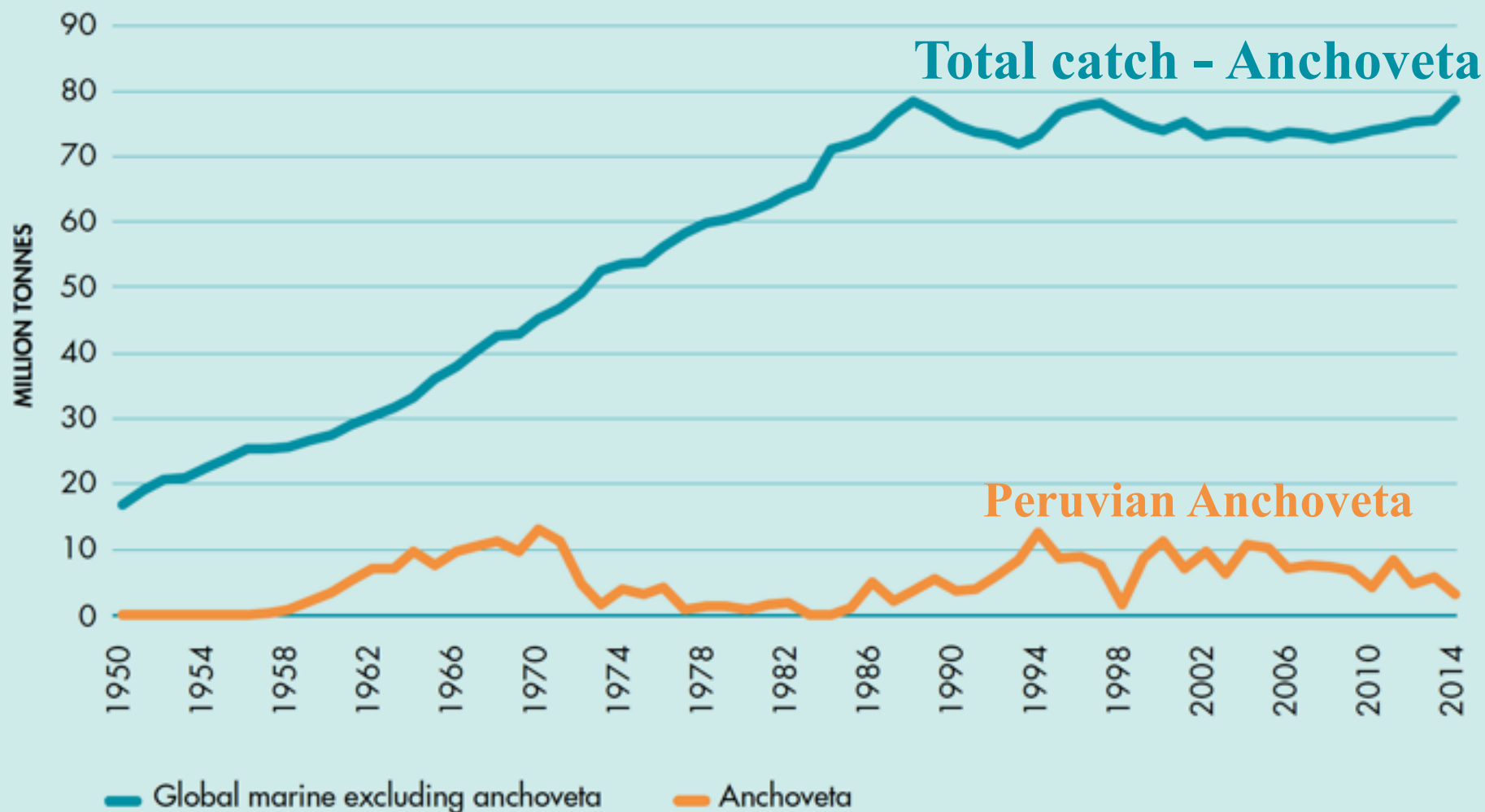
# End-to-End Modeling for CCS



# FAO Report (2016): The State of World Fisheries and Aquaculture

**FIGURE 3**

## TRENDS IN GLOBAL MARINE CATCHES, SEPARATED DATA FOR ANCHOVETA



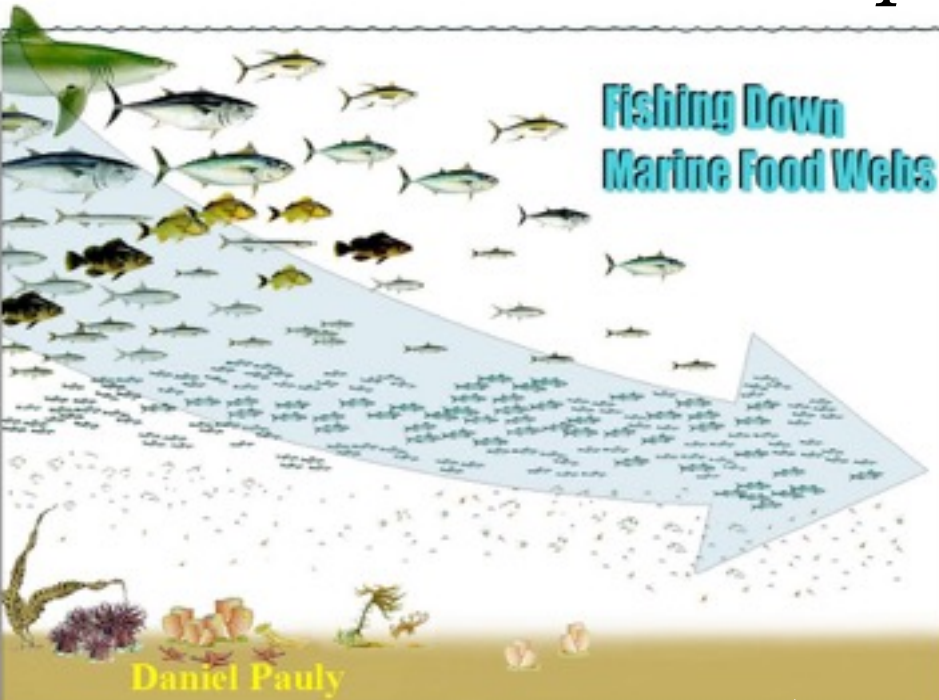




Peruvian Anchovy  
(Direct Human Consumption)



# Human Consumption of Anchoveta



A Japanese restaurant in Lima, 2006



Dr. Patricia  
Majluf



# Coastal and Marine Ecosystems in a Changing World

Prof. Fei CHAI

University of Maine, USA

Second Institute of Oceanography, China





# Summary and Recommendations

## *1. Climate and non-climate stressors*

- Warming, ocean acidification, and overfishing
- Anchoveta, sardine, cod, lobsters, and shellfish
- Connecting climate information to fish

## *2. New approach for sustainable development*

- Integrating natural/social science, management
- Matching of scales (climate, ecological, social)
- Globalization, population, changing culture



# Summary and Recommendations

## 3. *Recommendations*

- Monitoring from local to global
- Warming, OA and hypoxia are global issues with local effects, ecosystem processes are regional (EBUS)
- Regional programs (EBUS) to integrate climate, ecosystems, social for sustainable development
- Need for more international collaborations and coordinations, training and capacity building

# Modeled Plankton at surface (based 3km ROMS-CoSiNE)

