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### Part IV – Modeling the population dynamics





### Why taking into account environment is important?



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#### movements of skipjack tuna in the Pacific Ocean & ENSO



Exceptional recruitment of skipjack associated to a post-El Niño phytoplankton bloom.



ENSO (El Niño/La Niña) has a major influence on BOTH the distribution and the abundance of Pacific Skipjack Population



#### A system of ADR equations :

$$\partial_{t}N_{a} = \begin{cases} -\operatorname{div}(\mathbf{v}_{0}N_{0}) + \delta\Delta N_{0} - m_{0}N_{0} + S_{0} \\ -\operatorname{div}(\mathbf{v}_{0}N_{a}) + \delta\Delta N_{a} - m_{a}N_{a} + q_{0}N_{0} + \mathbf{\langle} - q_{a} \mathbf{\rangle}_{a}, \ a = 1, ..., \mathbf{\langle}_{L} + k_{J} - 1 \mathbf{\rangle}_{a} \\ -\operatorname{div}(\mathbf{v}_{a}N_{a}) + \operatorname{div}(D_{a}\nabla N_{a}) - (m_{a} + f_{a})N_{a} + q_{a-1}N_{a-1} + \mathbf{\langle} - q_{a} \mathbf{\rangle}_{a}, \\ a = \mathbf{\langle}_{L} + k_{J} \mathbf{\rangle}_{a}, K. \end{cases}$$

with Neumann boundary conditions

$$\mathbf{n} \cdot \mathbf{V}_a \big|_{\mathbf{x} \in \partial \Omega} = \mathbf{n} \cdot \nabla N_a \big|_{\mathbf{x} \in \partial \Omega} = 0$$

and initial conditions (densities of all cohorts at time 0):

$$S_0 = \Lambda \langle P_0, F_0, T_0 \rangle$$
$$N_0 = \overline{N}_0$$

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\*Preliminary work has been initiated for including tagging data into the optimization process

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### **Optimization method**

Parameters

### Maximum likelihood approach

Model

• Model predictions:

$$C_{t,f,i,j}^{pred} = q_f E_{t,f,i,j} \sum_{a=1}^{K} s_{f,a} w_a N_{a,i,j} \Delta x \Delta y, \quad Q_{t,f,a,r}^{pred} = \frac{s_{f,a} \sum_{i,j \in r} E_{f,i,j} N_{a,i,j} \Delta x \Delta y}{\sum_{a=1}^{K} f_{i,a} \sum_{i,j \in r} E_{f,i,j} N_{a,i,j} \Delta x \Delta y}$$

Application to tunas

Climate

• are being fit to observations by maximizing the likelihood function (or commonly, minimizing negative log-likelihood).

Catch likelihood:

Parameter scaling:

$$-L_{LF} = \sum_{t,f,a,r} \frac{1}{2\sigma_f^2} \Phi_{t,f,a,r}^{obs} - Q_{t,f,a,r}^{pr}$$

 Quasi-Newton minimization method being used requires evaluation of the gradient of cost function (*adjoint* variables) with respect to control parameters



**Exploitation** 



Application to tunas

unas

Climate



Parameters

Pre-	Pre-defined parameters		SKJ	YFT	BET	SP alb.
	Population structure					
	Number of larvae cohorts (month)		1	1	1	1
	Number of juvenile cohorts (month)		2	2	2	2
	Age at 1 <sup>st</sup> autonomous displacement	month	4	4	4	4
	Number of young cohorts		2	2	4	9
	(3 mo; 6 mo; 12 mo)		(3 mo)	(6 mo)	(6 mo)	(6 mo)
	Age at 1 <sup>st</sup> maturity	month	9	15	27	57
	Number of adult cohorts		12	12	16	11
	(3 mo; 6 mo; 12 mo)		(3 mo)	(6 mo)	(6 mo)	(12 mo)
	Growth					
$l_a$	Predator' size of cohort a	cm	*	*	*	*
w <sub>a</sub>	Predator' weight of cohort a	kg	*	*	*	*

Model

\* from independent studies (Langley et al., 2005; Hampton et al., 2006; Langley et al. 2007; Hoyle et al. 2008)



Paramete	rs estim	ated by the model	unit		
		Habitats			
1	$T_s$	Optimum of the spawning temperature function	°C		
2	$\sigma_{s}$	Std. Err. of the spawning temperature function	°C		
3	α	Larvae food-predator trade-off coefficient	-		
4	T <sub>a</sub>	Optimum of the adult temperature function at maximum age	°C		
5	$\sigma_{a}$	Std. Err. of the adult temperature function at maximum age	°C		
6	Ô	Oxygen value at $\Psi_0 = 0.5$	$ml \cdot l^{-1}$		
7*	γ	Curvature coefficient of the oxygen function	-		
	1	Movements			
8	V <sub>M</sub>	Meximum sustainable speed	B.L.·s <sup>-1</sup>		
9	с	coefficient of diffusion habitat dependence (defines the curvature and the minimum asymptotic value of the function)			
10**	η	Coefficient of diffusion density dependence (defines the curvature and the maximum asymptotic value of the function)			
	C	Larvae recruitment			
11	R <sub>s</sub>	Coefficient of larvae recruitment (Beverton-Holt function)	-		
	$\boldsymbol{\mathcal{C}}$	Mortality			
12	M <sub>Pmax</sub>	maximal mortality rate due to predation	mo <sup>-1</sup>		
13	M <sub>Smax</sub>	maximal mortality rate due to senescence	mo <sup>-1</sup>		
14*	$\beta_P$	slope coefficient in predation mortality	-		
15*	$\beta_{S}$	slope coefficient in senescence mortality	-		
16*	$A_{0.5}$	age at which $\frac{1}{2} M_{Smax}$ occurs	Mo		
17**	Е	Coefficient of variability of tuna mortality with food requirement	_		
		index			
		Fisheries			
	$q_f$	Catchability coeff. of fishery f	<b></b>		
For each	$S_f$	Target fish length of fishery <i>f</i>	cm		
fishery	$d_{f}$	Selectivity slope coeff. (if sigmoid function) or width (if Gaussian function) of fishery <i>f</i>			
	-				



Skipjack (Katsuwonus pelamis)

VS

Bigeye (Thunnus obesus)



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4 yrs + 75 cm / 20 kg 10-12 months Very high ~0.4 per month Micronekton

### Biology

← Lifespan →
← Max size / weight →
← Age at maturity →
← Fecundity →
← Natural mortality →
← Food →

### **Ecology**

Warm 20 – 30 °C Low! >3-4 ml l<sup>-1</sup> 0-200 m Tropical

 $\leftarrow \text{Thermal habitat} \rightarrow$ 

 $\leftarrow \mathsf{Oxygen tolerance} \rightarrow$ 

- $\leftarrow$  Vertical habitat  $\rightarrow$
- $\leftarrow$  Spatial distribution  $\rightarrow$

12 yrs (+) 180 cm / 225 kg 2.5 years Very high ~0.1(-) per month Micronekton

Large 10-30 °C Good! >1.5 ml l<sup>-1</sup> 0-1000 m Tropical to sub-temperate



### Pacific Skipjack tuna

**Application to tunas** 

**Parameters** 

Climate



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- Monthly catch data
  - 6 purse-seine
  - 1 long-line
  - 3 pole-and-line fisheries
- Quarterly length frequencies
   data

Model

for each fishery by 5x5, 5x10 or 10x20 degree squares



✓ Results published in Senina I., Sibert J., & Lehodey P. (2008). Parameter estimation for basin-scale ecosystem-linked population models of large pelagic predators: application to skipjack tuna. *Progress in Oceanography*, 78: 319-335.







### Pacific Skipjack tuna

**Application to tunas** 

**Parameters** 

#### Climate

#### Exploitation



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#### Key results are:

- General agreement between SEAPODYM & MFCL
- Major difference between the 2 models during post-El Niño ecosystem conditions (1978–1982 and 1992–1997, 1999-2002)

Model

- Direct relationship between ENSO events (SOI) and skipjack recruitment
- The general trend in abundance of the adult stock is predictable 8 months in advance simply using the SOI

Recent ENSO bulletin indicates that "Current observations and dynamical model forecasts indicate El Niño conditions will continue to intensify and are expected to last through Northern Hemisphere winter 2009-10".



Based on the relationship identified above, the Pacific skipjack biomass should increase in the second half of 2010, following the decrease that likely occurred during the past year.

Biomass (10<sup>6</sup> mt)

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### Pacific Bigeye tuna

**Application to tunas** 

**Parameters** 

### Monthly catch data

- 4 purse-seine in WCPO; 1 pole-and-line fisheries
- 3 purse-seine in EPO; 9 longline fisheries

Model

3 fisheries Phil. And Ind.

### **Quarterly length frequencies data**

by fishery by 5, 10 or 20 degree squares

✓ Results will be published in Lehodey P., Senina I., Sibert J., Bopp L, Calmettes B., Hampton J., Murtugudde R. (accepted). Preliminary forecasts of population trends for Pacific bigeye tuna under the A2 IPCC scenario. Progress in Oceanography. CLIOTOP Special Issue

The "easiest" optimization experiment, that quickly provided a good fit to data and plausible set of biological parameter



- A lot of information (fishing data) for both juvenile to adult over a very large geographical extension, i.e., all the Pacific Basin, including temperate regions

- The influence of both seasonal and interannual signals can be captured by the model



Climate



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16

221

251

0.0025

-48

0.005

5

Ξ

0.0075

61

191

0.01

251

683

221

-48 ·

5

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### Application to tunas **Climate Change**

**Parameters** 

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scenario

Forecasting the impact of Climate Change on marine ecosystems and tuna resources is a huge challenge!

Model

Preliminary work has been carried with SEAPODYM However, we need a very large international collaborative effort involving all the research community to get the most possible reliable analysis of potential impacts.

GLOBEC/IMBER CLIOTOP PROGRAMME 1<sup>st</sup> International Conference, Mexico •25 Countries, + 200 participants •Special issue in Progress in Oceanography (30 ms)

### Mid-term Review meeting in UNESCO, Paris, Feb 2010.

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**Climate impact** 



# ModelParametersApplication to tunasClimate impactExploitationClimate Change

- Forecasting the impact of Climate Change on marine ecosystems and tuna resources is a huge challenge!
- Preliminary work has been carried with SEAPODYM
   However, we need a very large international collaborative effort involving all the research community to get the most possible reliable analysis of potential impacts.
- ➢ We need comparative analyses, between species models, and oceans.
- We need a public global tuna fishing data set, easily available to the entire research community



Such public domain datasets exist for Indian and Atlantic Oceans but not for Pacific Ocean. An official request was addressed to WCPFC and IATTC directors this year. Unfortunately, IATTC (M. Hinton) already transmitted two negative responses from Chinese

Taipei and Japan concerning longline fishing data available in IATTC database.

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is compensated by an increase of larvae biomass in subtropical regions, but increasing mortality of older stages due to lower habitat values (too warm surface temperatures, decreasing oxygen concentration in the sub-surface, and less food), and displacement of surviving fish to the eastern region led to stable then declining adult biomass at the end of the Century.

**Exploitation** 

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### Pacific Bigeye tuna

**Parameters** 

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### Climate versus Fishing Impact:

Model

- Historical Fishing effort until 2000
- Projection with average 1995-2000 fishing effort after 2000 under IPCC A2 (business as usual) scenario (obviously not a realistic fishing effort scenario!)







### MPA simulations

**Parameters** 



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**Exploitation** 

✓ Use the best configuration to test the impact of implementing nofishing areas in international enclaves between EEZs, with 3species (skj, yft bet) and multiple fisheries.

Model

□ This requires the definition of scenarios for fishing effort redistribution outside of these areas



**Climate impact** 

Application to tunas



## Model Parameters Application to tunas MPA simulations



#### Bigeye tuna catch through 1980-2005 period: 3% of total WCPO LL catch 12% of total WCPO PS catch

#### **Bigeye tuna simulations:**

S0: no MPA (actual E)
S1: MPA (E is lost);
S2: no MPA, E reduction
S3: MPA, E redistribution



1980 1982 1984 1986 1988 1990 1992 1994 1996 1998 2000 2002 2004







- Lehodey P. and Senina I. (2009). SEAPODYM user's manual. Information paper. WCPFC-SC5-2009/EB-IP-13
- Lehodey P., Senina I., & Murtugudde R. (2008). A Spatial Ecosystem And Populations Dynamics Model (SEAPODYM) - Modelling of tuna and tuna-like populations. *Progress in Oceanography*, 78: 304-318.
- Senina I., Sibert J., & Lehodey P. (2008). Parameter estimation for basin-scale ecosystem-linked population models of large pelagic predators: application to skipjack tuna. *Progress in Oceanography*, 78: 319-335.
- Lehodey P., Murtugudde R., Senina I. (*accepted*). Bridging the gap from ocean models to population dynamics of large marine predators: a model of mid-trophic functional groups. *Progress in Oceanography.* Special issue of the EUR-OCEANS conference "Parameterisation of Trophic Interactions in Ecosystem Modelling", 20-23 March 2007, Cadiz, Spain.
- Lehodey P. Senina I., Sibert J., Bopp L, Calmettes B., Hampton J., Murtugudde R. (*accepted*). Preliminary forecasts of population trends for Pacific bigeye tuna under the A2 IPCC scenario. *Progress in Oceanography.* Special issue of the 1<sup>st</sup> international CLIOTOP Symposium, La Paz, Mexico, 3-7 Dec 2007