

Comisión Interamericana del Atún Tropical  
Inter-American Tropical Tuna Commission



**Spatiotemporal dynamics of the dolphin-associated purse-seine  
fishery for yellowfin tuna in the Eastern Pacific Ocean (SAC-09-09)**

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# Outline

## Spatiotemporal dynamics of the dolphin-associated purse-seine fishery for yellowfin tuna in the Eastern Pacific Ocean

- Background
- Data and Methods
- Results
- Discussion

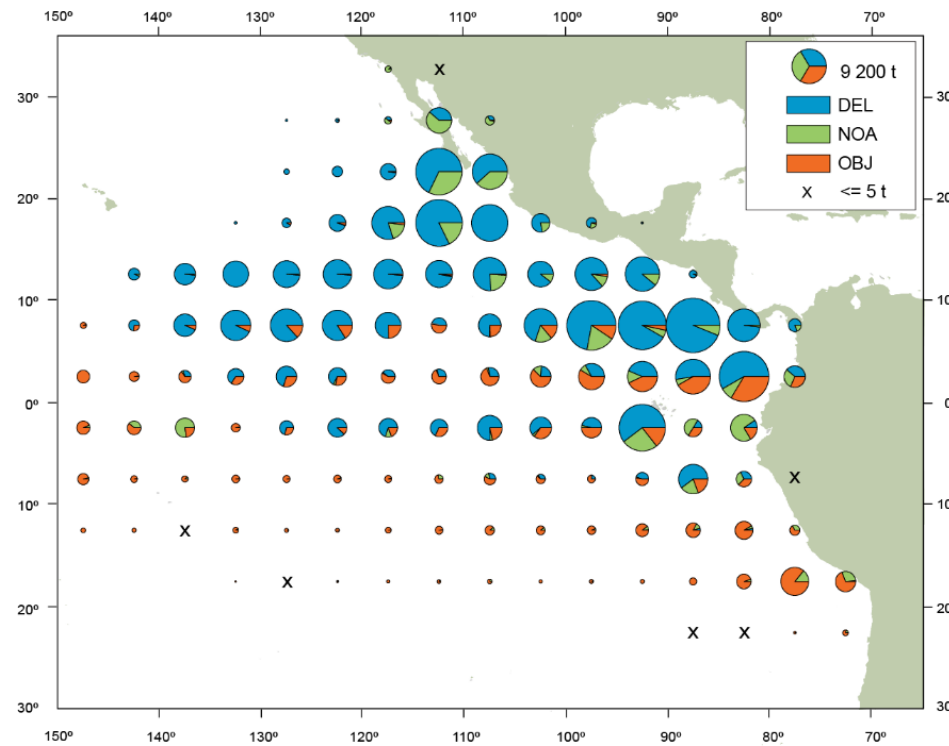
# Background

- Goal: develop a standardized purse-seine index of abundance for yellowfin tuna in the Eastern Pacific Ocean
- Importance: index of abundance directly informs trend in population biomass and is a key input in the stock assessment
- Difficulties: index of abundance for yellowfin is derived solely from fishery-dependent CPUE data → preferential sampling and sparse spatial coverage

# Background

## Dolphin-associated purse-seine fishery for yellowfin

- Takes the largest catch of yellowfin in the EPO
- Contributes to two of the five indices of abundance used in the stock assessment

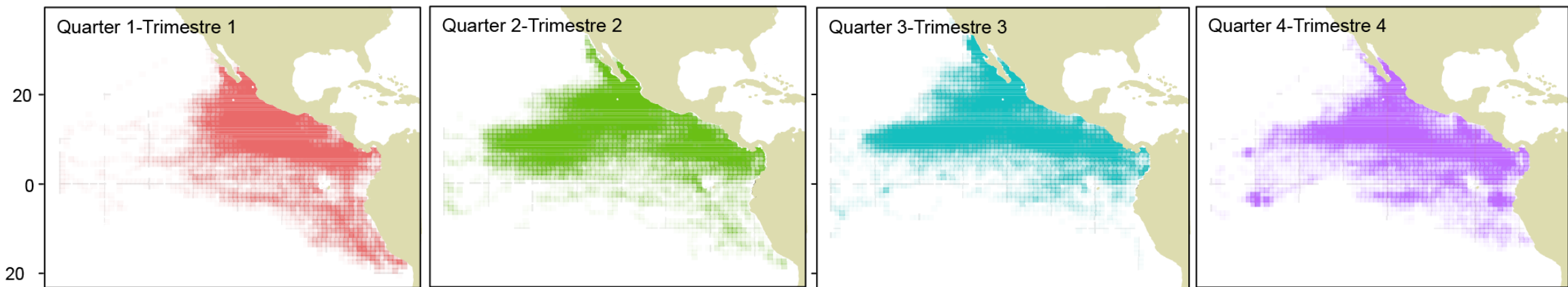


From SAC-09-03

# Data

- Per-vessel catch (in metric tons) and effort (in days fishing) data from the vessels with >75% dolphin-associated sets
- Spatial resolution of 1° x 1° and temporal resolution of 1 day during 1975-2016
- Nominal CPUE = catch / effort

Spatial coverage of the dolphin-associated fishery by quarter



# Methods: spatiotemporal modelling

delta-generalized linear mixed model: VAST (Thorson and Barnett, 2017)

separately models encounter probability ( $p$ ) and positive catch rate ( $\lambda$ ):

$$p_i = \text{logit}^{-1}(\beta_1(t_i) + L_{\omega_1}\omega_1(s_i) + L_{\varepsilon_1}\varepsilon_1(s_i, t_i) + L_{\delta_1}\delta_1(v_i))$$

$$\lambda_i = \exp(\beta_2(t_i) + L_{\omega_2}\omega_2(s_i) + L_{\varepsilon_2}\varepsilon_2(s_i, t_i) + L_{\delta_2}\delta_2(v_i))$$

$\beta_1(t_i)$  &  $\beta_2(t_i)$ : intercept in year  $t_i$

$\omega_1(s_i)$  &  $\omega_2(s_i)$ : spatial variation at location  $s_i$

$\varepsilon_1(s_i, t_i)$  &  $\varepsilon_2(s_i, t_i)$ : spatiotemporal variation at location  $s_i$  in year  $t_i$

$\delta_1(v_i)$  &  $\delta_2(v_i)$ : effect of vessel  $v_i$  on catchability

# Methods: spatiotemporal modelling

Autocorrelated **spatial** and **spatiotemporal** residuals:

$$\omega_1 \sim \text{MVN}(\mathbf{0}, \mathbf{R}_1)$$

$$\omega_2 \sim \text{MVN}(\mathbf{0}, \mathbf{R}_2)$$

$$\varepsilon_1(, t) \sim \text{MVN}(\mathbf{0}, \mathbf{R}_1)$$

$$\varepsilon_2(, t) \sim \text{MVN}(\mathbf{0}, \mathbf{R}_2)$$

where

$$\mathbf{R}_1(s, s') = \frac{1}{2^{\nu-1}\Gamma(\nu)} \times (\kappa_1 |\mathbf{H}(s - s')|)^{\nu} \times K_{\nu}(\kappa_1 |\mathbf{H}(s - s')|)$$

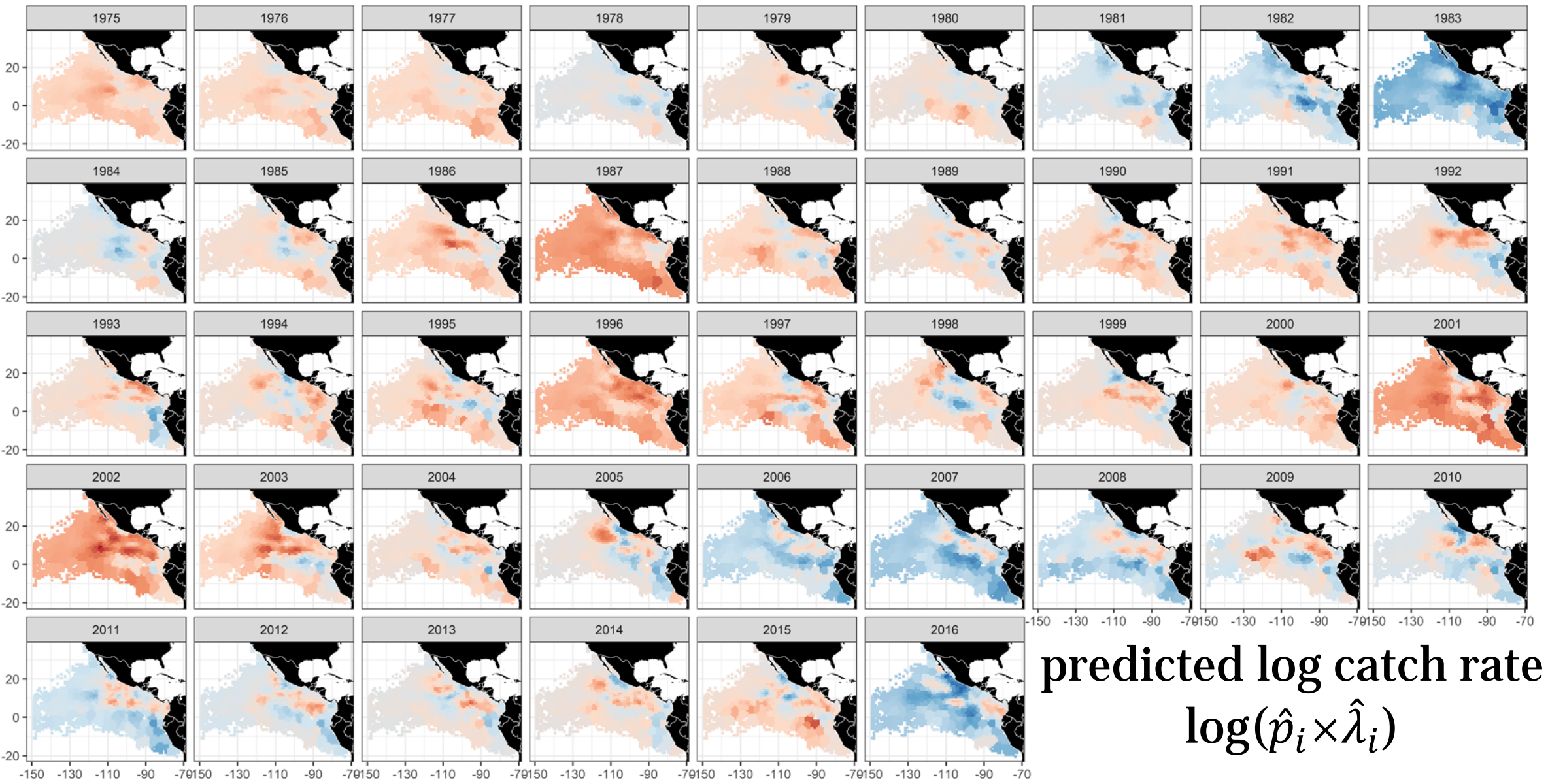
$$\mathbf{R}_2(s, s') = \frac{1}{2^{\nu-1}\Gamma(\nu)} \times (\kappa_2 |\mathbf{H}(s - s')|)^{\nu} \times K_{\nu}(\kappa_2 |\mathbf{H}(s - s')|)$$

decorrelation  
distance

geometric  
anisotropy

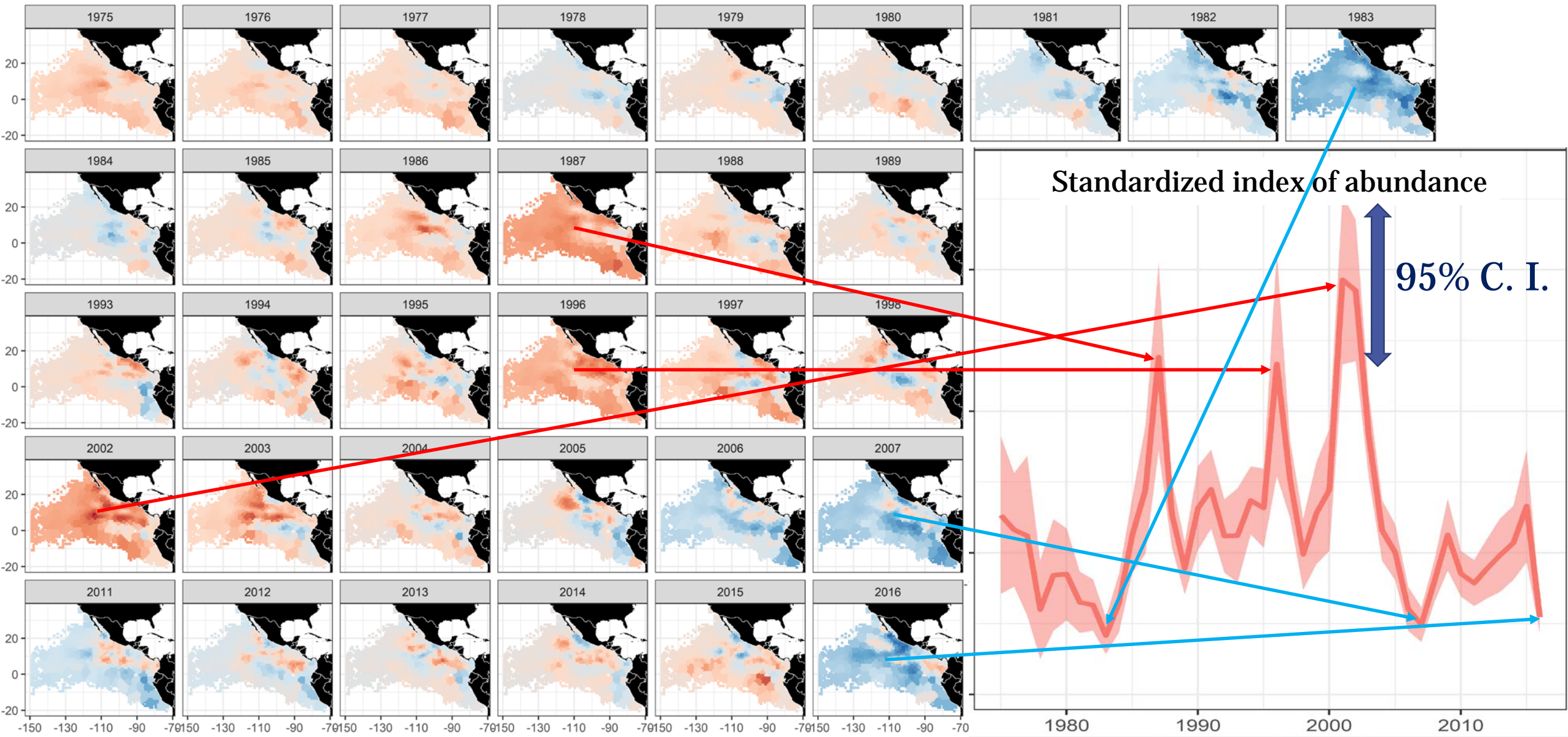
Matern  
smoothness

# Results: quarter1 as an example

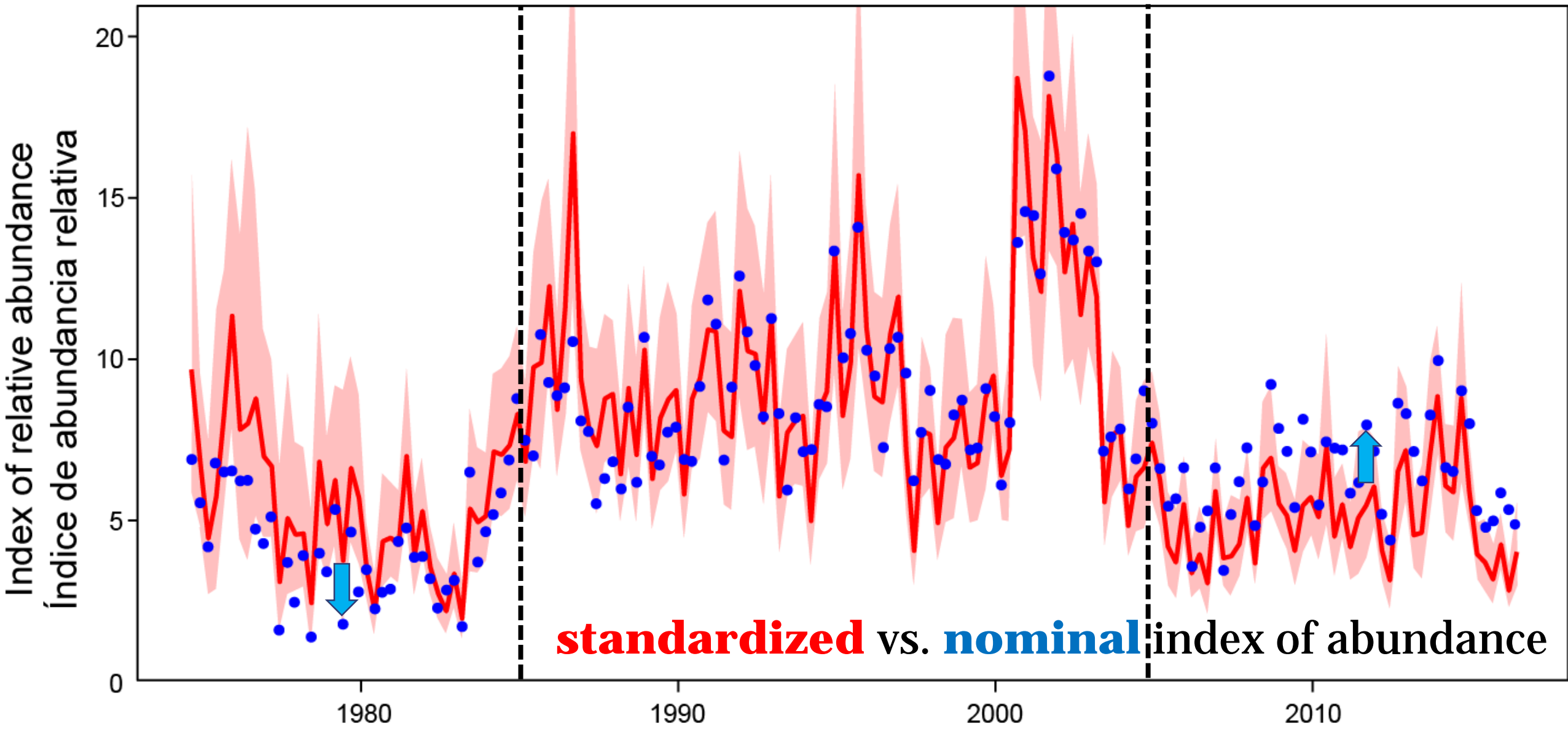




# Results: quarter1 as an example



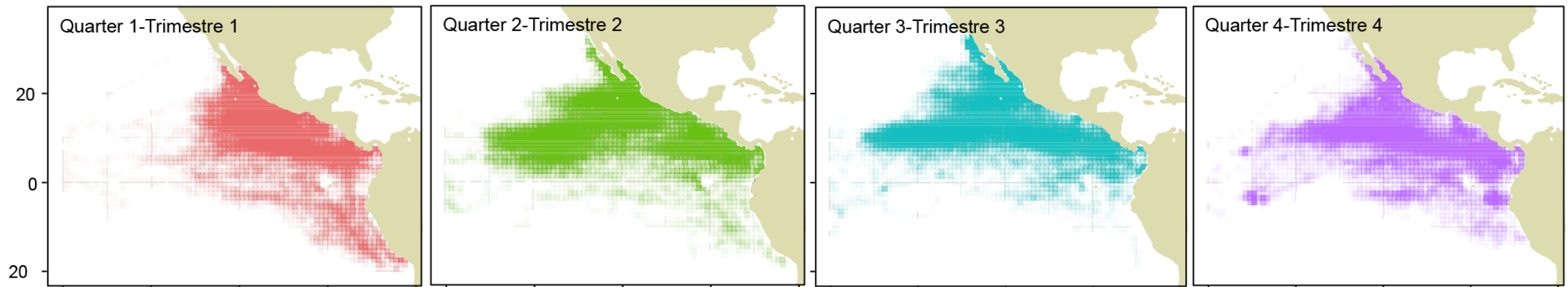
# Results: combine all four quarters



# Discussion: potential biases in the standardized index

Due to a large seasonal variation in fishing locations, each quarter's data were fitted to the spatiotemporal model separately.

Spatial coverage of the dolphin-associated fishery by quarter



# Discussion: potential biases in the standardized index

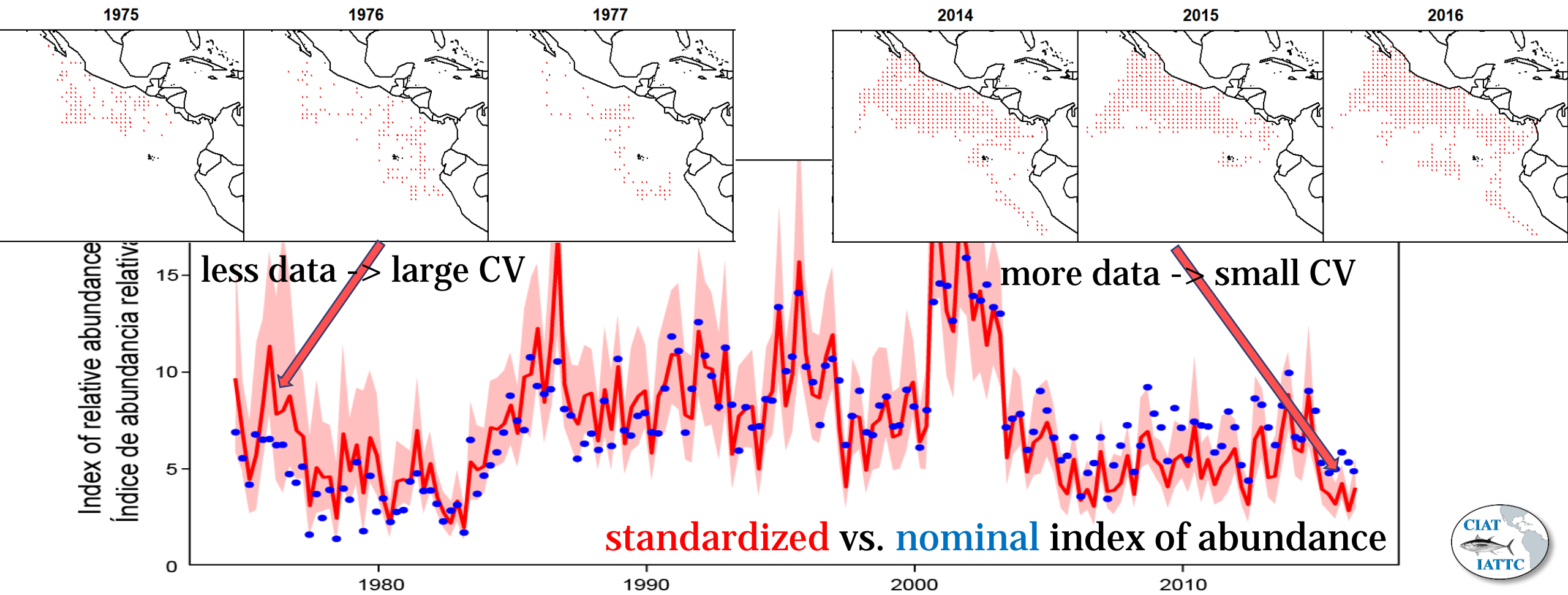
Due to a large seasonal variation in fishing locations, each quarter's data were fitted to the spatiotemporal model separately.

1. Catchability could be quarter-specific (environmental conditions vary from quarter to quarter)
2. Autocorrelations in the spatial and spatiotemporal residuals could be different (driven by different processes: static vs. dynamic)
3. Imputed catch rates for the unsampled region could be biased in different ways by quarter

# Discussion: standardized index vs. nominal index

The standardized index represents an **improvement** because the approach:

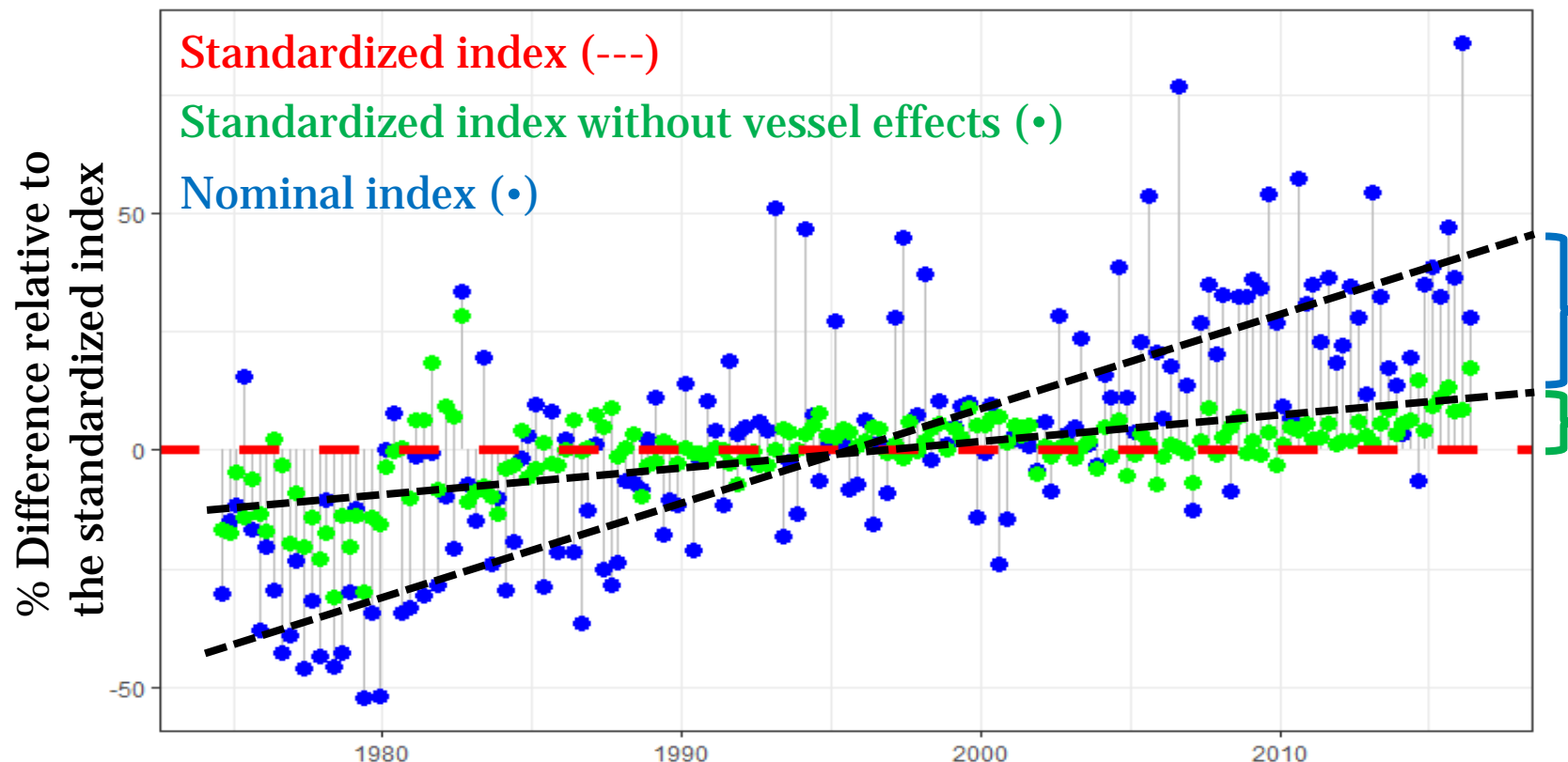
1. Estimates the coefficient of variation (CV) of the index



# Discussion: standardized index vs. nominal index

The standardized index represents an **improvement** because the approach:

2. Includes vessel effects on catchability
3. Accounts for preferential sampling

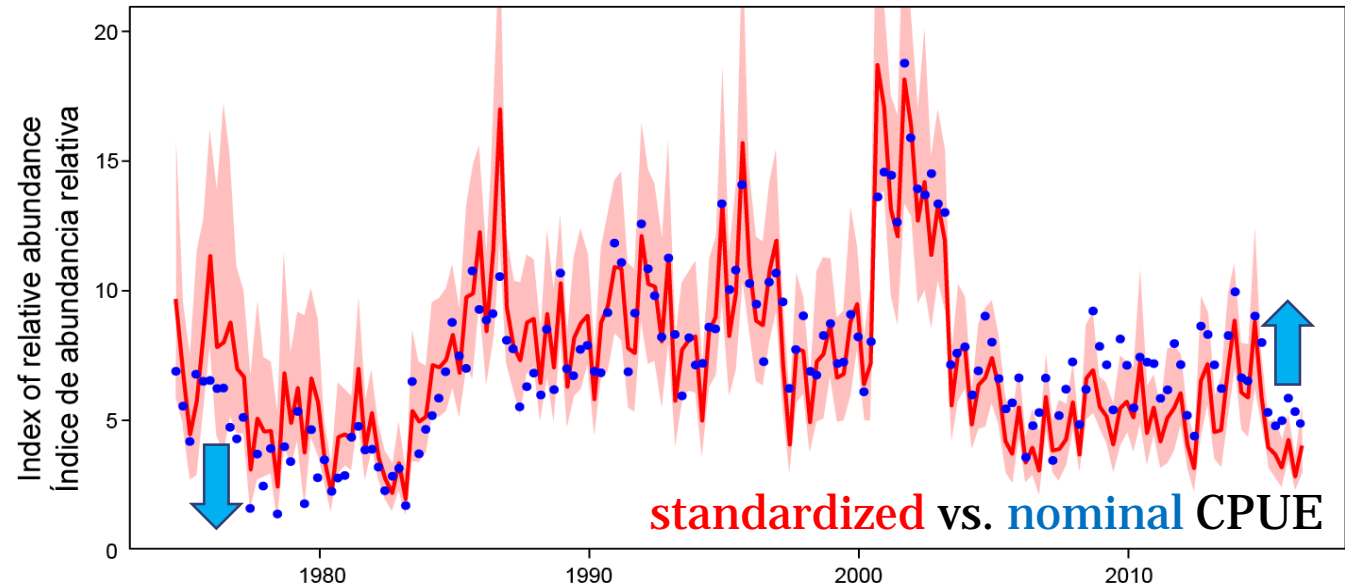


Each vessel was better at finding fishing hotspots over time -> overestimating the trend in biomass

New vessels were more efficient than old vessels -> overestimating the trend in biomass

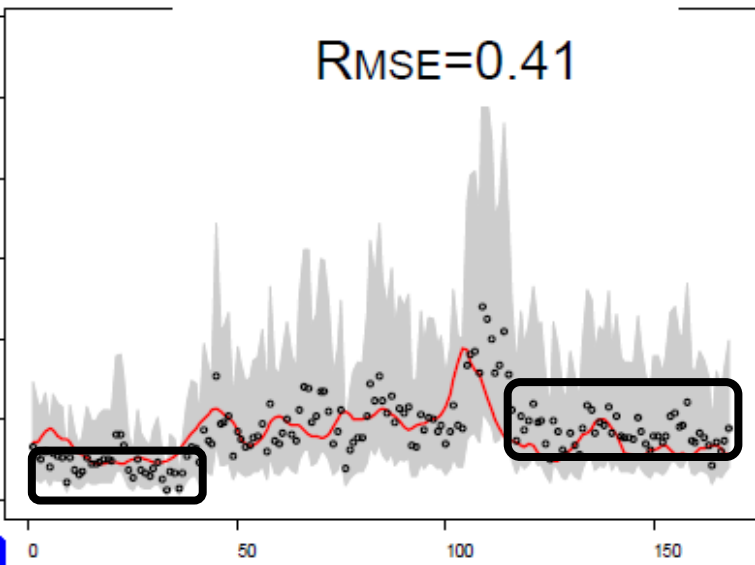
# Discussion: next phase of this project

Replace the **nominal** CPUE by the **standardized** CPUE for the dolphin-associated purse-seine fishery



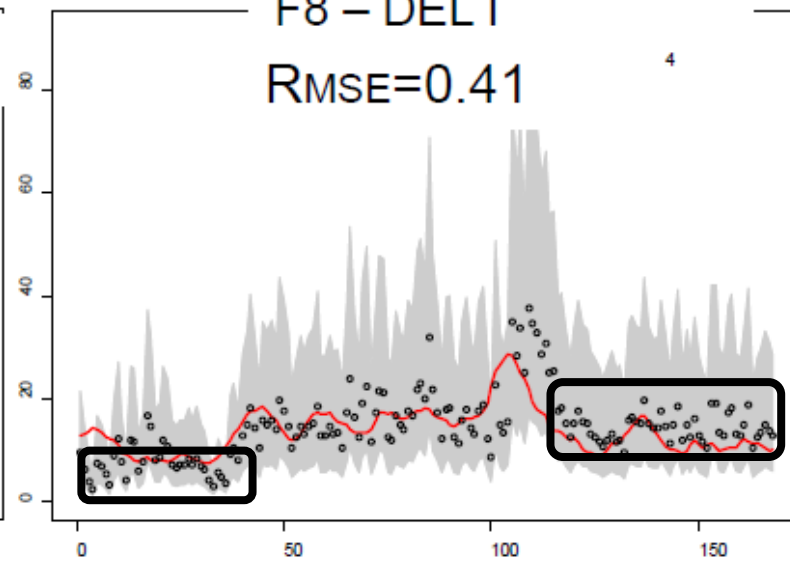
F7 – DEL N

RMSE=0.41



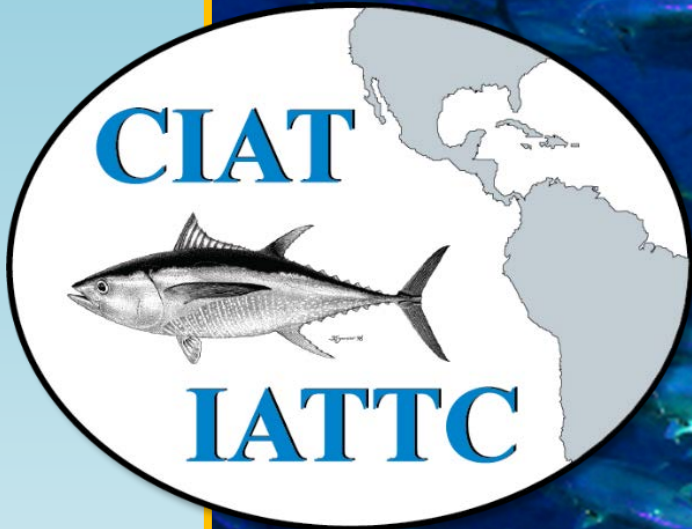
F8 – DEL I

RMSE=0.41



<- From last year's assessment report

**Red line: model prediction**  
**Black dots: nominal CPUE**



# Questions

