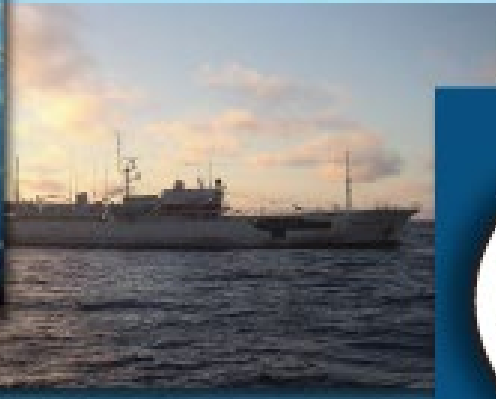


Comisión Interamericana del Atún Tropical  
Inter-American Tropical Tuna Commission



Purse-Seine index of abundance and length frequency for  
yellowfin tuna in the EPO

- **Index of abundance**

Class-6 PS vessels' catch and effort data:

- Per-vessel data on catch (in metric tons) and effort (in days fishing)
- Estimating fishing effort is difficult: select vessels that made  $\geq 75\%$  of sets on dolphin

- **Length frequency for the index of abundance**

Class-6 PS vessels' length frequency data:

- $5^\circ Lat * 5^\circ Lon * year\_month$
- Select vessels that made  $\geq 75\%$  of sets on dolphin
- Length is grouped into 10cm bins from 20 cm to 190+ cm

# Data

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# Model Structure (Index of abundance)

VAST separately models encounter probability ( $p$ ) and positive catch rate ( $\lambda$ ) for each catch rate observation  $i$ :

$$\begin{aligned}\text{logit}(p_i) &= \beta_1(t_i) + l_{\omega_1}\omega_1(s_i) + l_{\varepsilon_1}\varepsilon_1(s_i, t_i) + l_{\delta_1}\delta_1(v_i) \\ \log(\lambda_i) &= \beta_2(t_i) + l_{\omega_2}\omega_2(s_i) + l_{\varepsilon_2}\varepsilon_2(s_i, t_i) + l_{\delta_2}\delta_2(v_i)\end{aligned}$$

$\beta(t_i)$ : intercept in year  $t_i$

$\omega(s_i)$ : spatial variation at location  $s_i$ ;  $l_{\omega}$ : scaling factor

$\varepsilon(s_i, t_i)$ : spatiotemporal variation at location  $s_i$  in year  $t_i$ ;  $l_{\varepsilon}$ : scaling factor

$\delta(v_i)$ : vessel effects on catchability;  $l_{\delta}$ : scaling factor

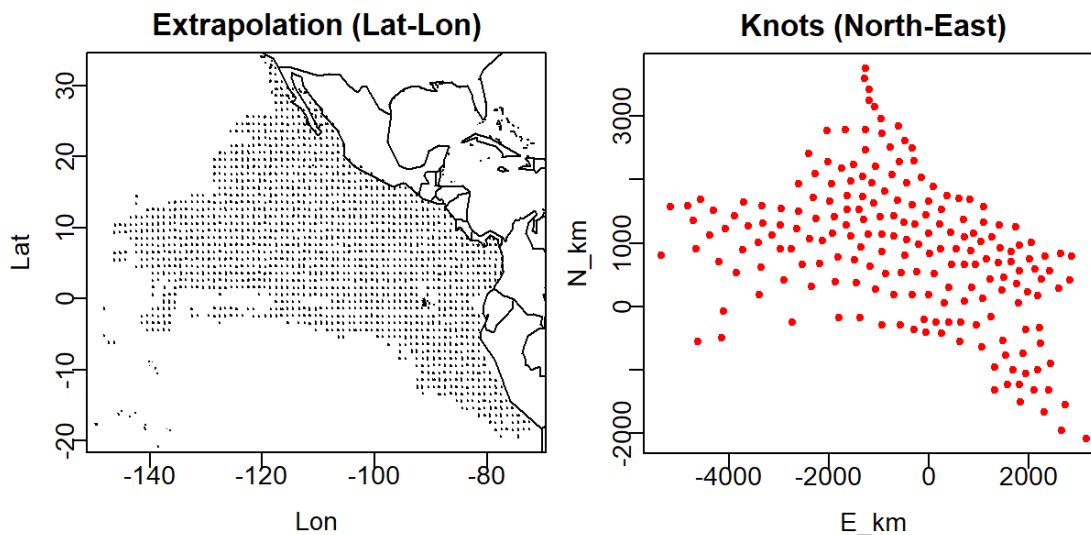
# Model Structure (Index of abundance)

The probability of catch data  $c$  for sample  $i$ :

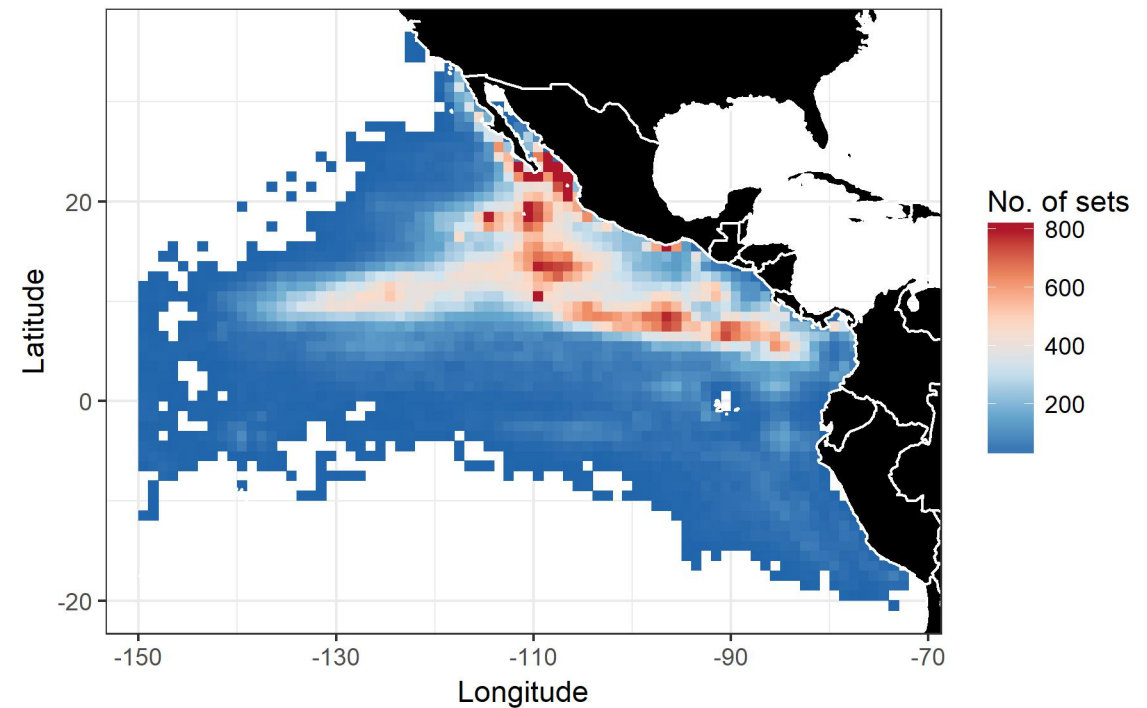
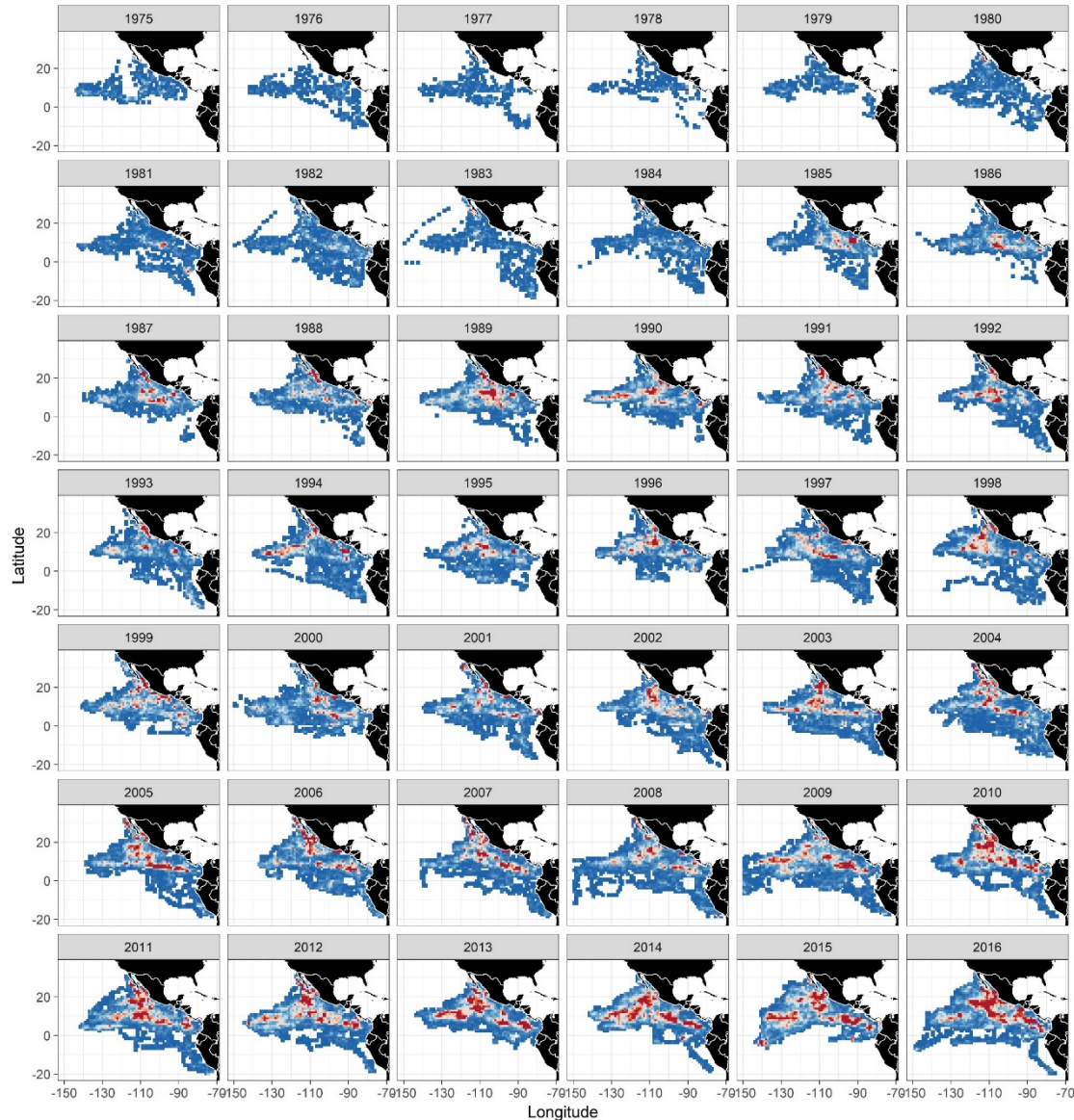
$$\Pr(c_i = c) = \begin{cases} 1 - p_i & \text{if } c = 0 \\ p_i \times \text{Lognormal}(c_i | \log(\lambda_i), \sigma_m^2) & \text{if } c > 0 \end{cases}$$

where  $c_i = \frac{\text{catch}_i(\text{in tons})}{\text{effort}_i(\text{in days})}$

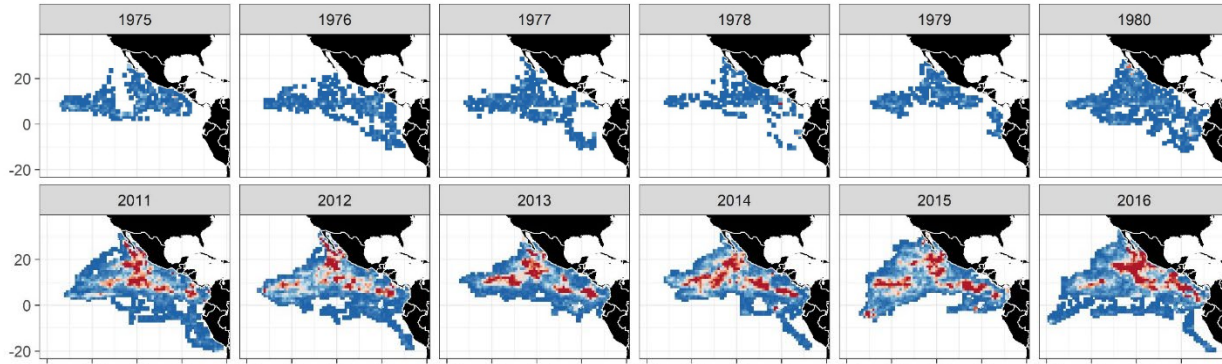
The standardized index is area-weighted:  $I(t) = \sum_{k=1}^{200} (\text{area}(k) \times \text{density}(k, t))$



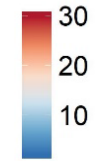
# Spatiotemporal distribution of sample locations



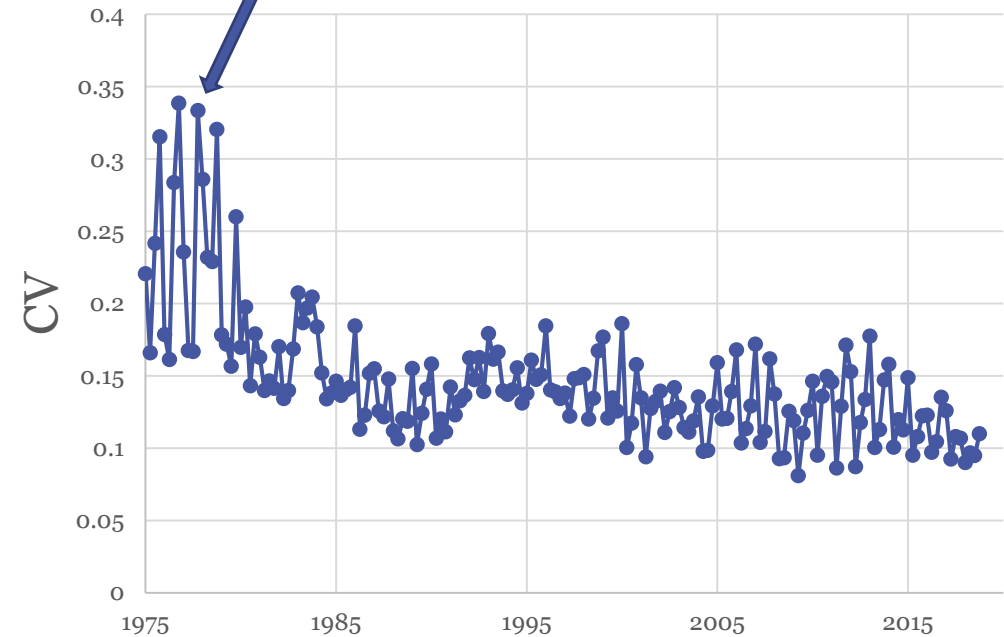
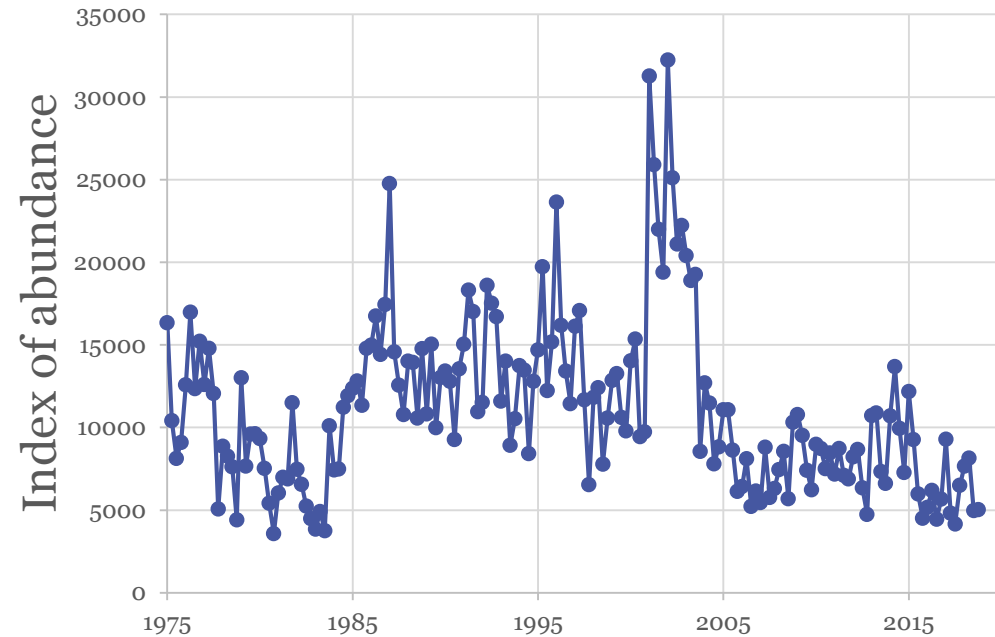
# Results



No. of sets



Low spatial coverage and sample size

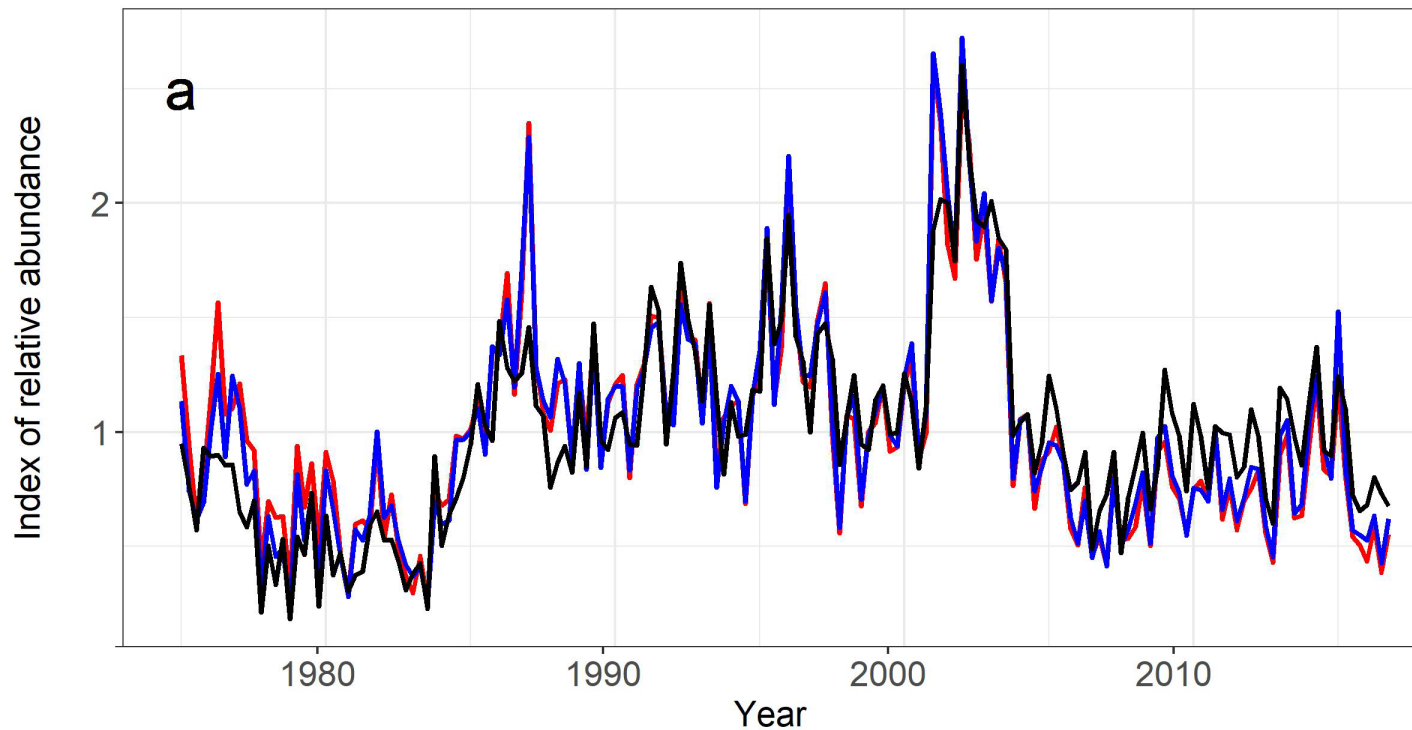


# Standardized vs. Nominal index

Red: standardized index with vessel effects

Blue: standardized index without vessel effects

Black: nominal index



- Standardized index suggests a more pessimistic population abundance trend
- Average vessel efficiency increased over time



# Data

- **Index of abundance**

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- Estimating fishing effort is difficult: select vessels that made  $\geq 75\%$  of sets on dolphin

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- $5^\circ Lat * 5^\circ Lon * year\_month$
- Select vessels that made  $\geq 75\%$  of sets on dolphin
- Length is grouped into 10cm bins from 20 cm to 190+ cm

# Model Structure (Length composition)

VAST separately models encounter probability ( $p$ ) and positive catch rate ( $\lambda$ ) for each catch rate observation  $i$ :

$$\text{logit}(p_i) = \beta_1(l_i, t_i) + \sigma_{\omega_1}(l_i)\omega_1(l_i, s_i) + \sigma_{\varepsilon_1}(l_i)\varepsilon_1(l_i, s_i, t_i)$$

$$\log(\lambda_i) = \beta_2(l_i, t_i) + \sigma_{\omega_2}(l_i)\omega_2(l_i, s_i) + \sigma_{\varepsilon_2}(l_i)\varepsilon_2(l_i, s_i, t_i)$$

$\beta(l_i, t_i)$ : intercept for length  $l_i$  in year  $t_i$

$\omega(l_i, s_i)$ : spatial variation for length  $l_i$  at location  $s_i$ ;  $\sigma_{\omega}(l_i)$ : scaling factor for length  $l_i$

$\varepsilon(l_i, s_i, t_i)$ : spatiotemporal variation for length  $l_i$  at location  $s_i$  in year  $t_i$ ;  $\sigma_{\varepsilon}(l_i)$ : scaling factor for length  $l_i$

**\*\*\* No interaction among length bins (computationally too expensive)**

# Model Structure (Length composition)

The probability of catch data  $c$  for sample  $i$ :

$$\Pr(c_i = c) = \begin{cases} 1 - p_i & \text{if } c = 0 \\ p_i \times \text{Lognormal}(c_i | \log(\lambda_i), \sigma_m^2) & \text{if } c > 0 \end{cases}$$

where  $c_i = \frac{\text{length-specific catch}_i(\text{in number})}{\text{effort}_i(\text{in days})}$  --- CPUE by length (20, 30, 40, ... , 190)

The length-specific standardized index is area-weighted:

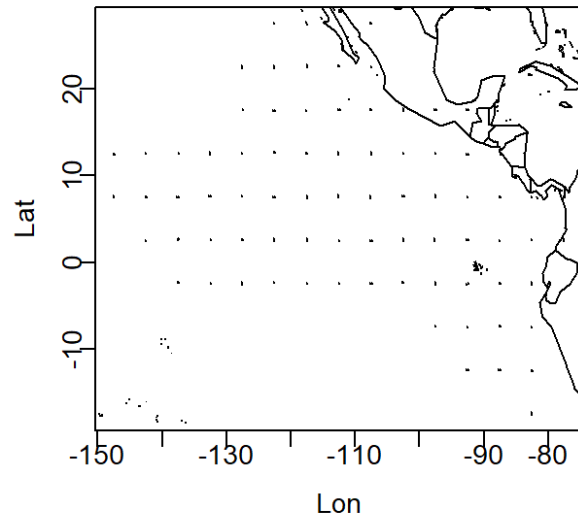
$$I(l, t) = \sum_{k=1}^{50} (\text{area}(k) \times \text{density}(l, k, t))$$

Standardized length composition:

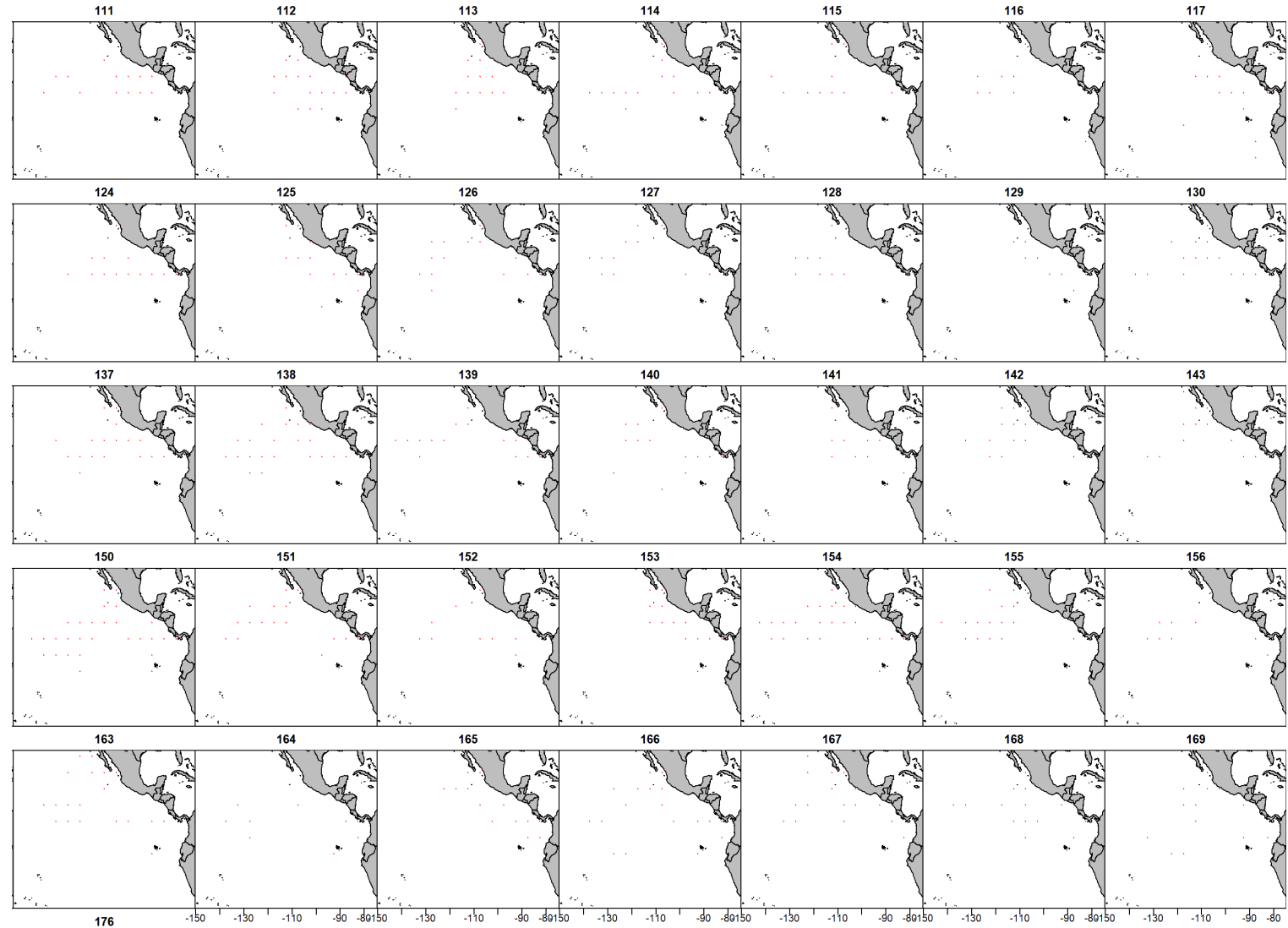
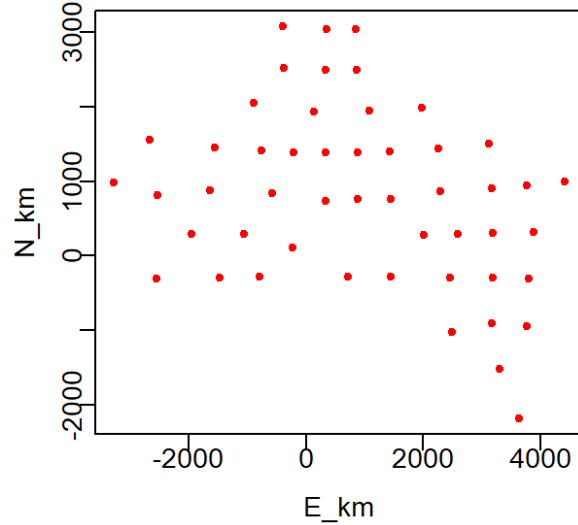
$$P(l, t) = \frac{I(l, t)}{\sum_{l=1}^{n_l} I(l, t)}$$

# Sample distribution

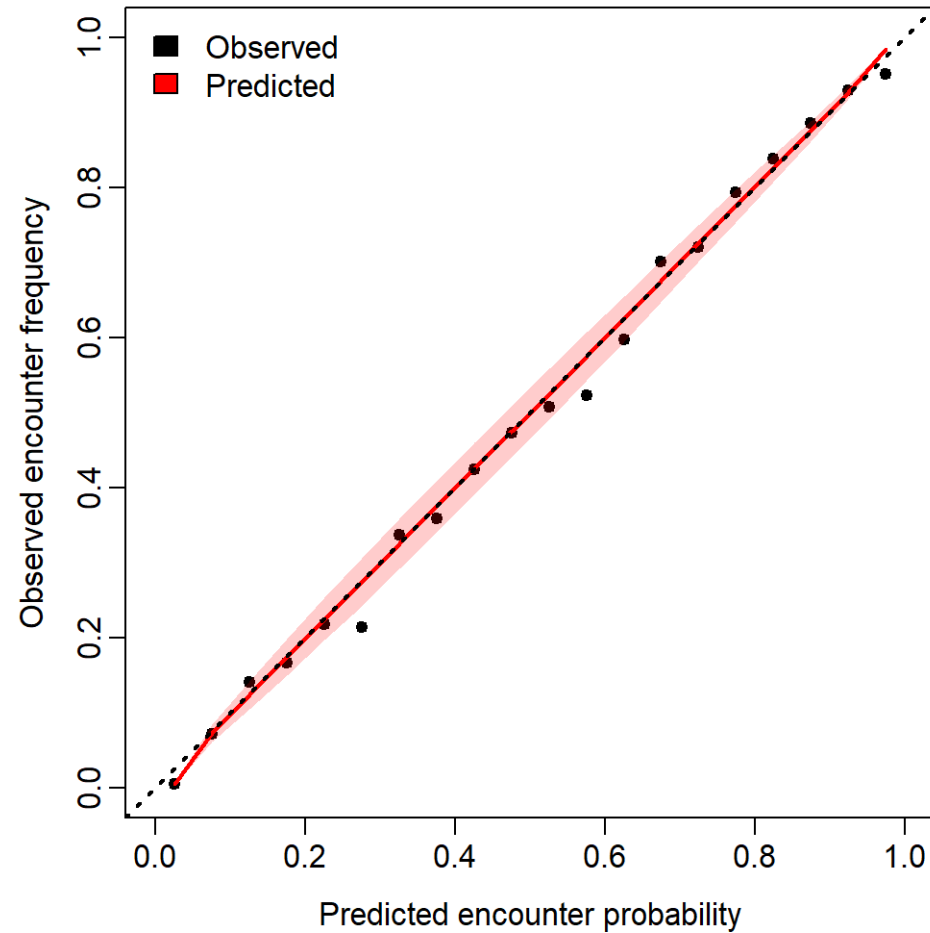
Extrapolation (Lat-Lon)



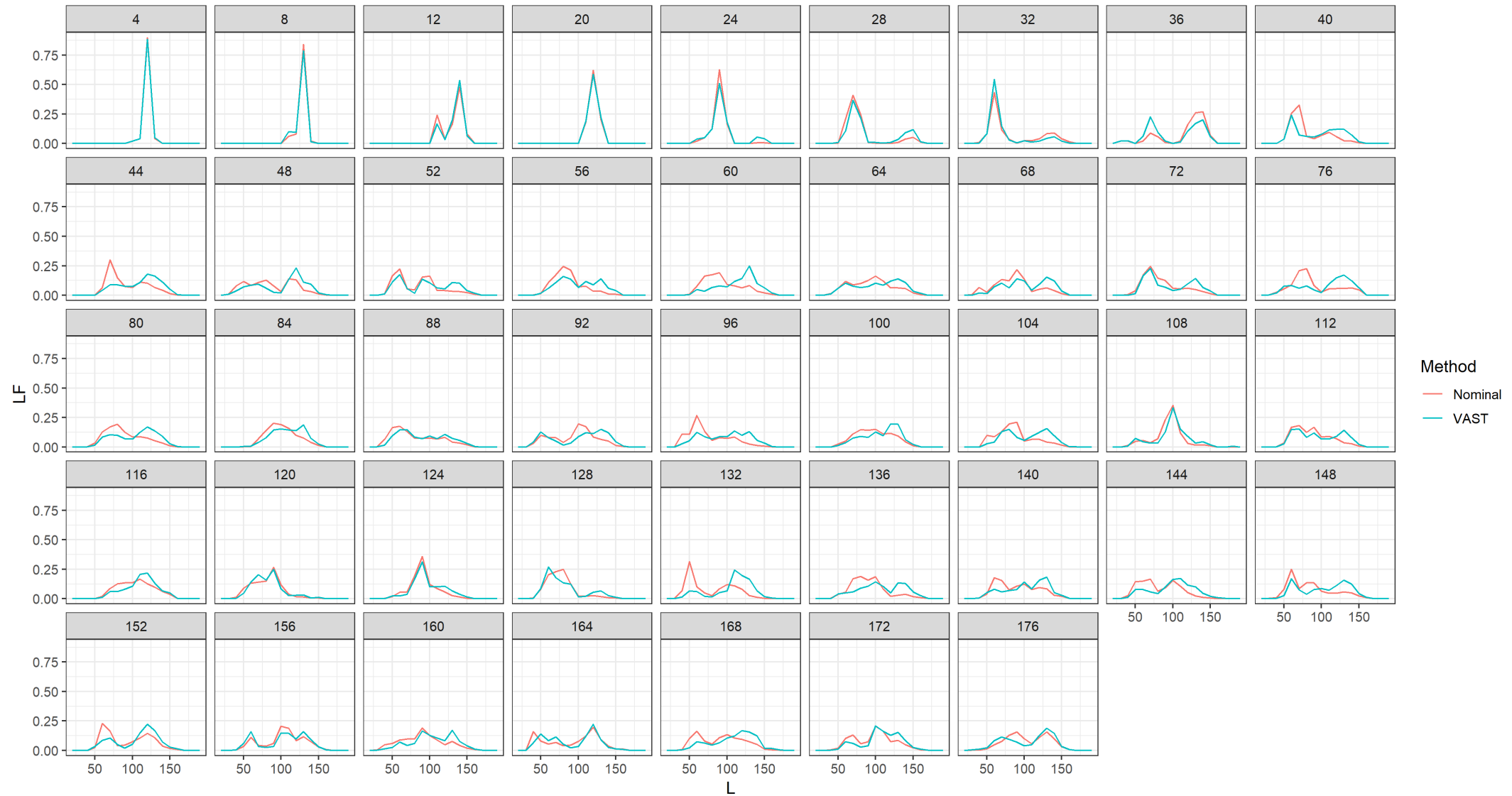
Knots (North-East)



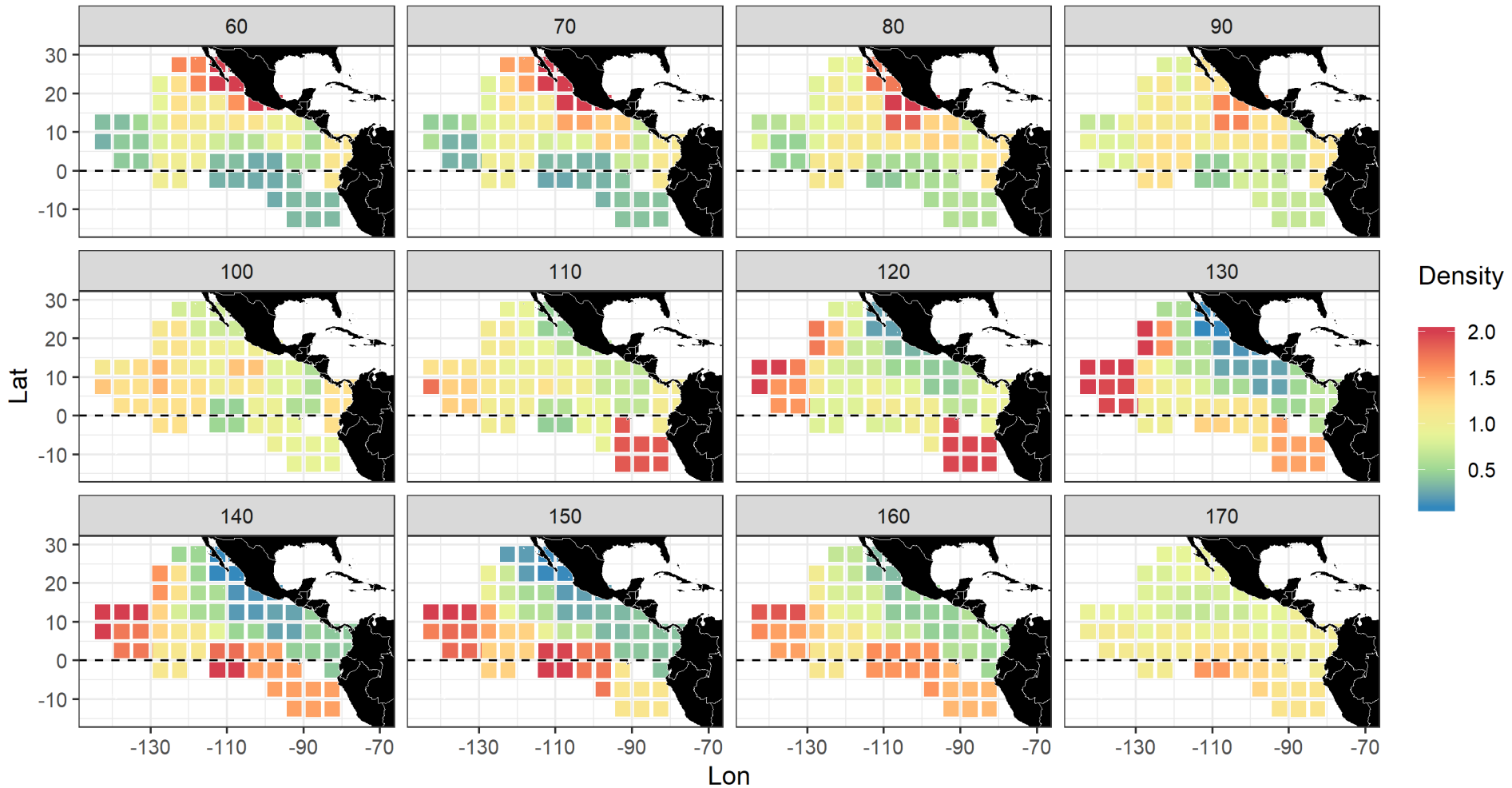
# Model diagnostics



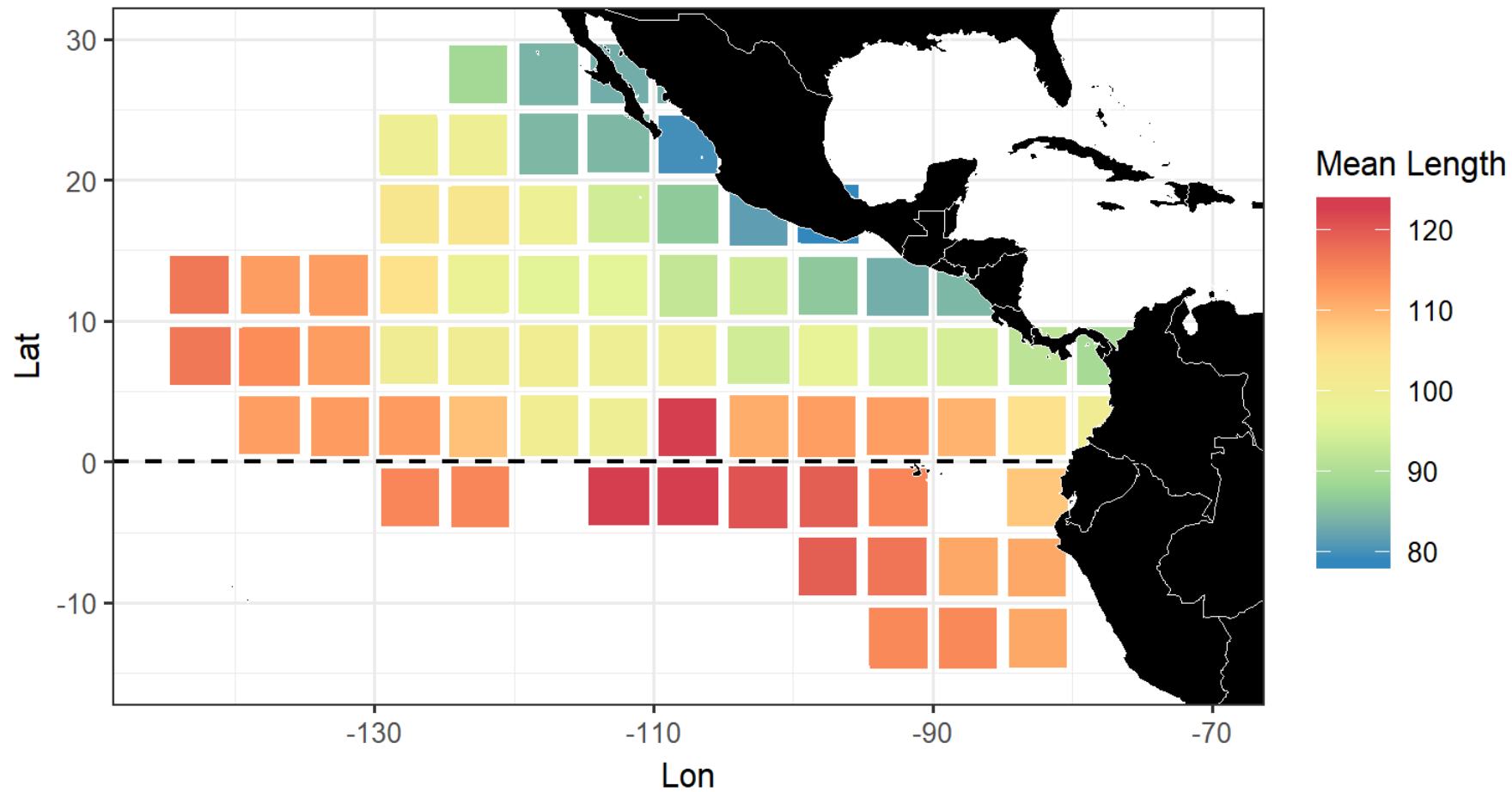
# Nominal vs. Standardized Length Composition



# Mean YFT density by length (cm)

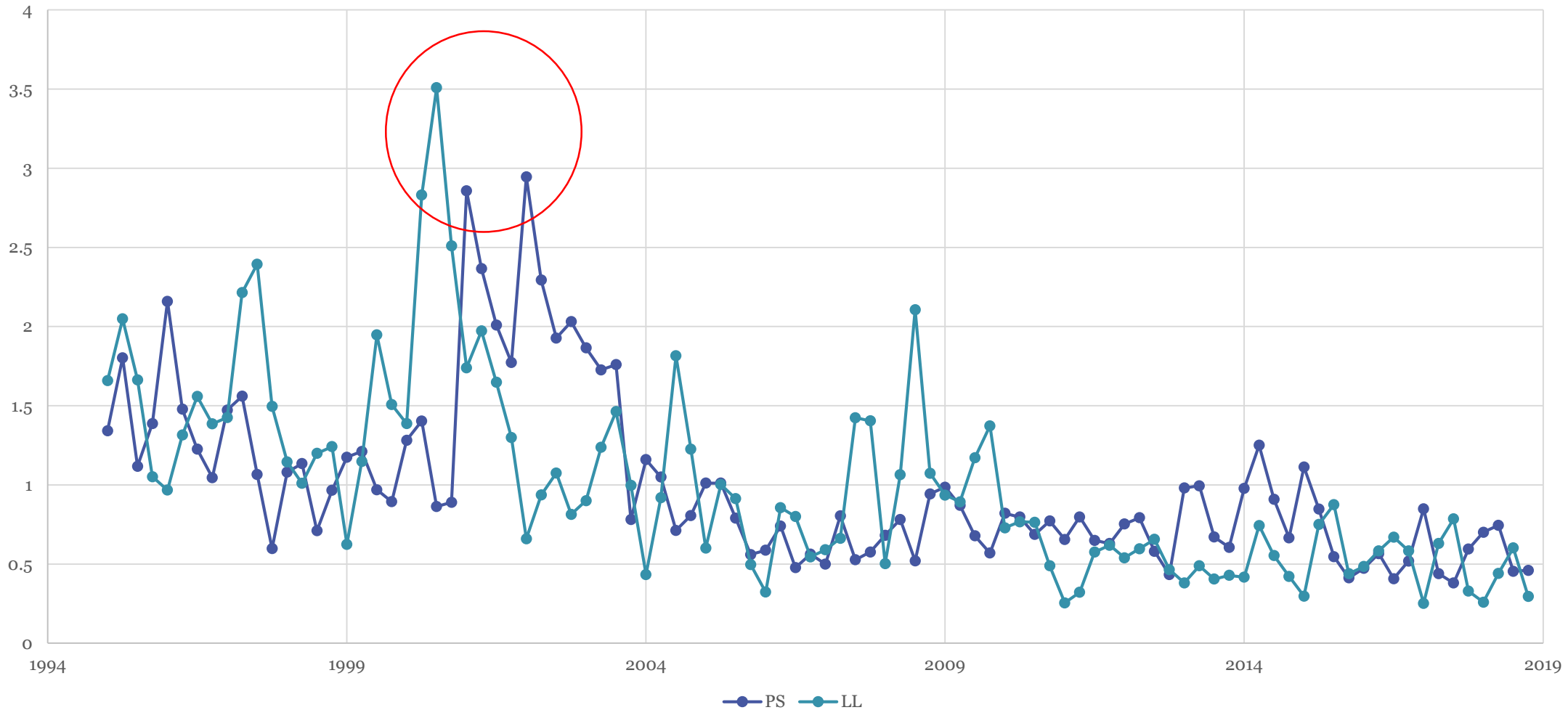


# Mean YFT length (cm) in the fishery





# Mis-match between LL and PS index of abundance



# Summary

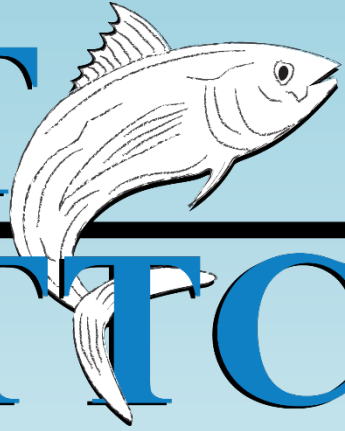
## Index of abundance

- Vessel effects are included
- High CV in early years due to low sample size and low spatial coverage
- The peak is ~ 1 year after the longline peak

## Length composition

- Nominal and standardized LFs are notably different (low sample size?)
- Only large bin size (10cm) is feasible in the standardization model
- A map of mean spatial catch rate by length can inform fisheries' selectivity

# CIAT IATTC



Questions