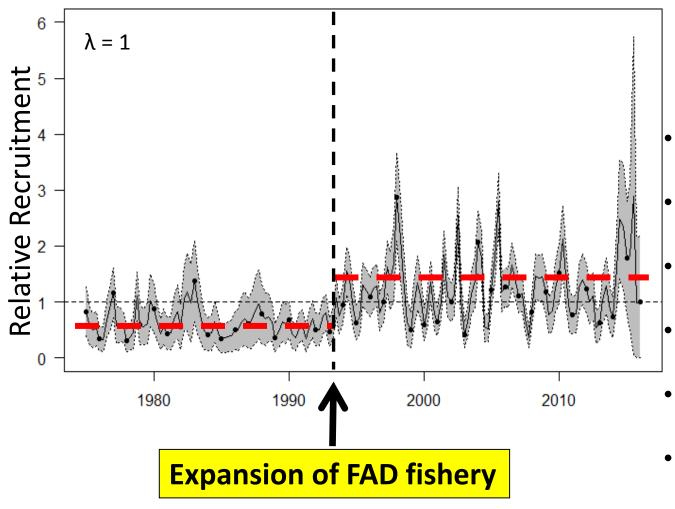


#### Outline

- Motivation for this work
  - Resolve BET stock assessment model misspecifications (Spatial mismatch)
    - Improve BET stock assessment
    - Develop more realistic operating models for ongoing Management Strategy Evaluation (MSE)
- Approach
  - Age-structured production models (ASPM) for alternative spatial sub-areas of the EPO
  - Integrated model for EPO's Central area (largest spatial mismatch between PS catch and LL index)
- Results
- Summary conclusions
- Future directions



### The two-regime BET recruitment pattern

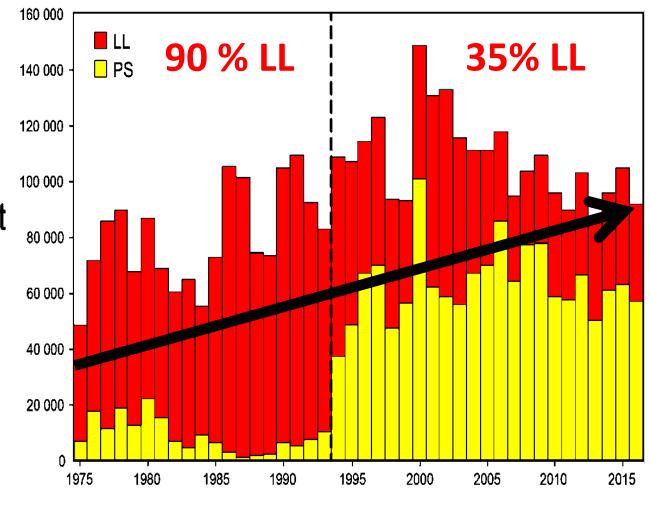


Recurs in BET assessments since 2003 Alternative hypotheses:

- Environmental shift (Fonteneau and Ariz, 2008)
- Underestimated early FAD catch (Idem)
- Higher natural mortality (Idem)
- Density-dependent growth (Hoyle, SPC)
- Migratory pattern changes (Harley, SPC)
- Artifact due to large catches of small individuals by the purse-seine fishery (Maunder et al., 2010)
- Spatial mismatch between PS catch and LL CPUE index (Aires-da-Silva and Maunder, 2010)



# Expansion of FAD fishery

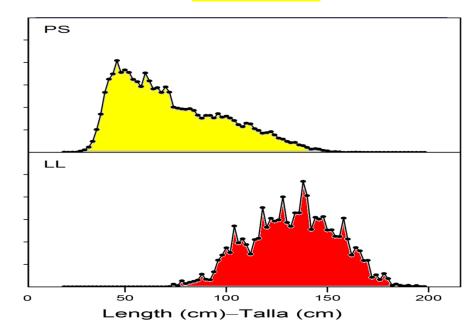


Year - Año

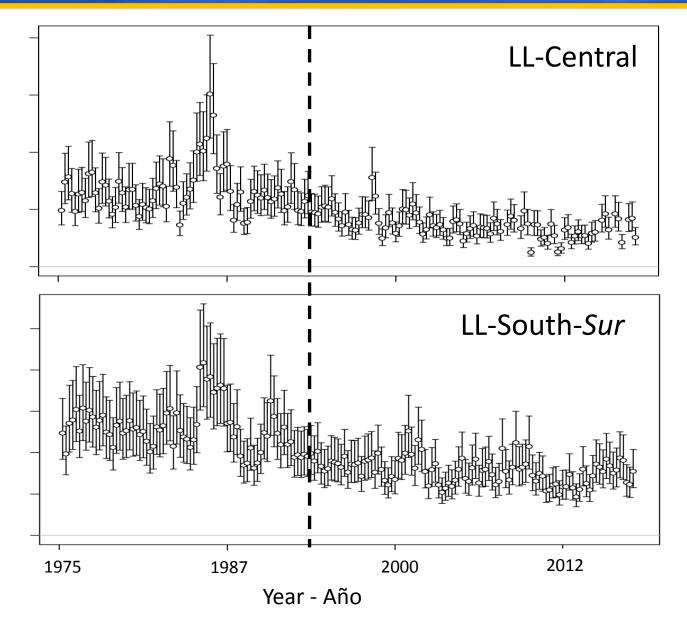
Expansion of **Purse Seine** fishery

Increased TOTAL catch

#### Smaller fish in **Purse Seine** fishery



### Longline CPUE main source of information

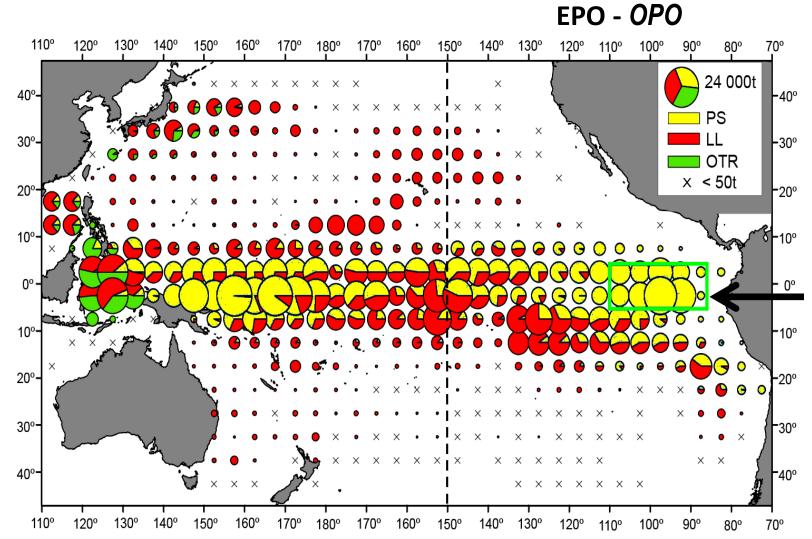


#### **Current BET assessment**

- Longline CPUE indices are the main source of information in the BET stock assessment
  - Purse seine CPUE indices are not used in the assessment
  - Size composition data is greatly down weighted (0.05 of original weight)



### Spatial heterogeneity among fishery catches



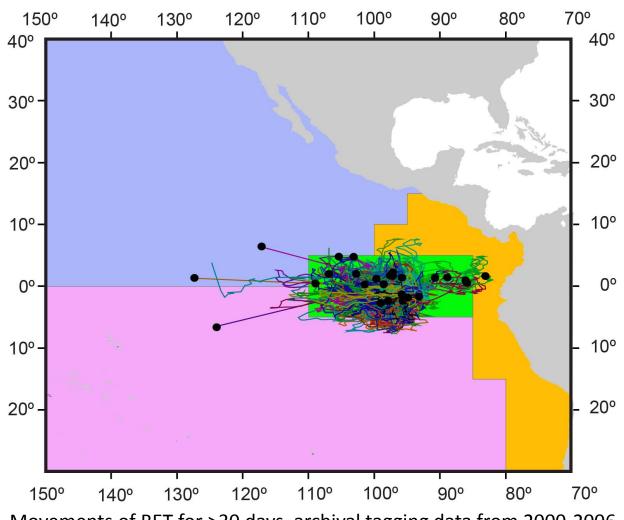
- Most of PS catches from Equatorial area
  - Between 5°N and 5°S
- Little LL catch in Equatorial area
  - Between 5°N and 5°S from 110°W to 85°W

**Central Area** 



BET catch during 2008-2012 (modified from Schaefer et al. 2015)

### Spatial heterogeneity in BET movements

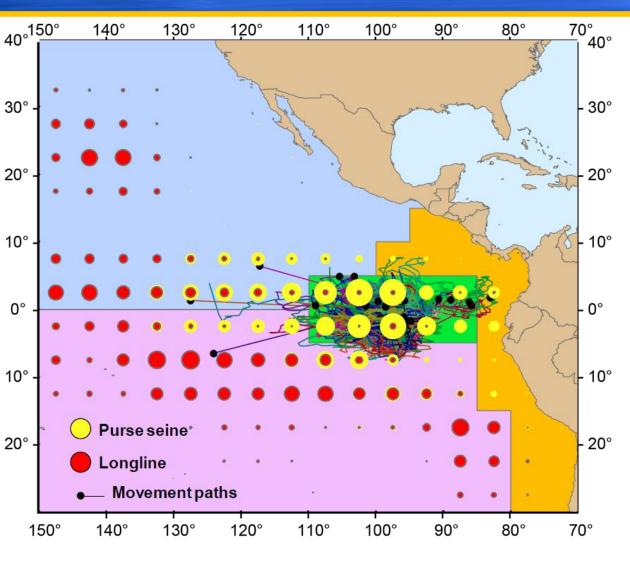


Movements of BET for >30 days, archival tagging data from 2000-2006 (Schaefer and Fuller 2009)

- Current BET assessment uses a single area,
  assuming stock is randomly mixed within the
  EPO, with no localized spatial dynamics
- However, tagging indicate restricted movements for some areas, regional fidelity in particular in the Central area
- Restricted movements in some areas, combined with spatial heterogeneity of catches, suggest that localized depletion of BET sub-stocks may exist in the EPO



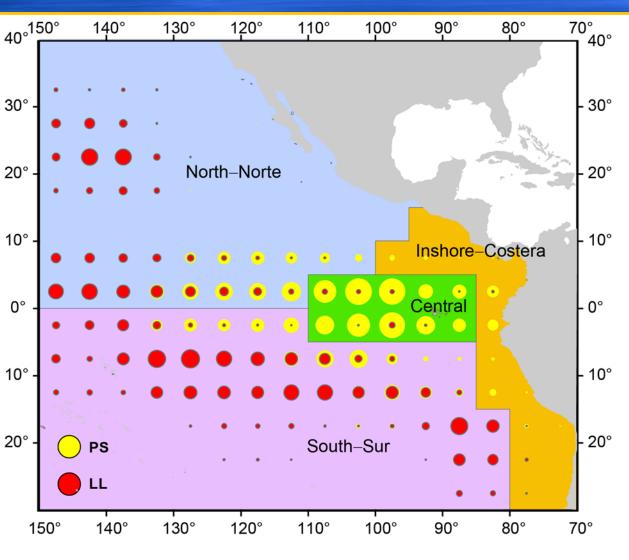
## The "spatial mismatch" hypothesis



#### This hypothesis postulates that:

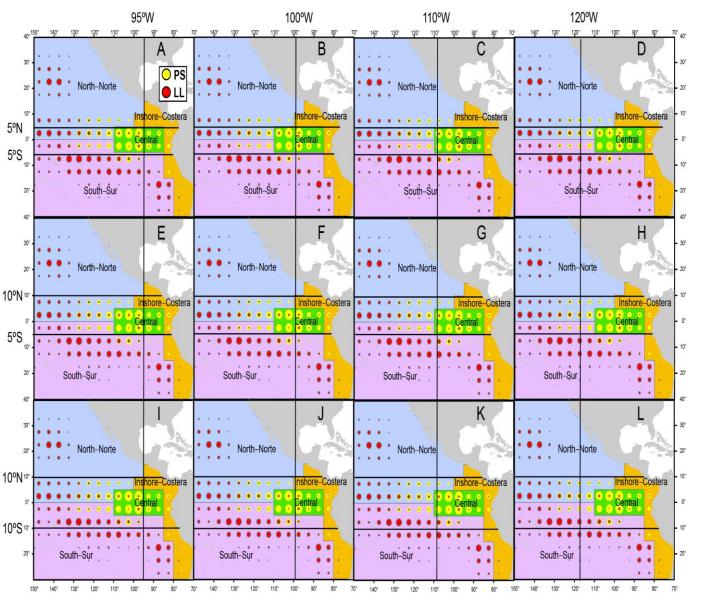
- The two-recruitment pattern results from spatial misspecification in the assessment
- The increase in purse seine-catch in the equatorial area is not reflected in a reduction in longline CPUE due to:
  - Restricted BET movements, leading to local depletion, and
  - The longline CPUE corresponding to a wider, or different, area than where the increased purse-seine catch occurred

## The "spatial mismatch" hypothesis



- If the spatial mismatch hypothesis is correct, a spatially-structured BET assessment should correct the two-regime recruitment pattern
- Aires-da-Silva and Maunder (2010) tested this hypothesis fitting spatially independent models for four EPO areas, resulting in different trends and depletion levels among areas and a partial correction of the recruitment pattern-

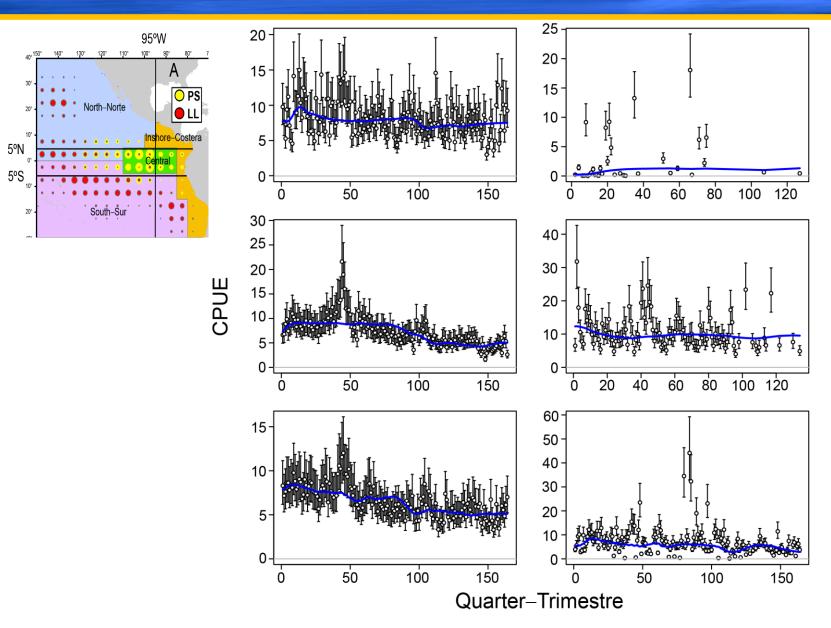




#### **Evaluates consistency between catch & CPUE**

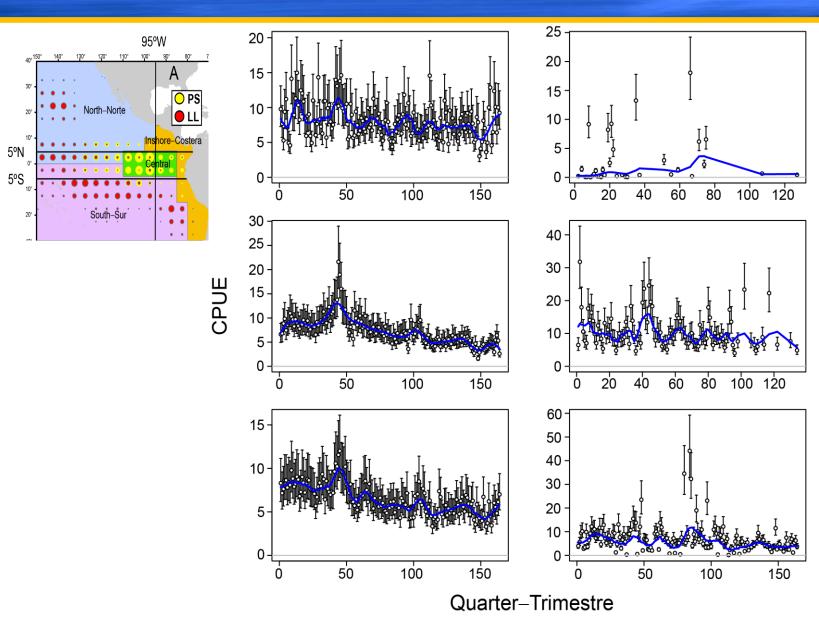
- Systematically divide the EPO into 12 grids of 6 areas each (72 total areas)
- Fit an independent ASPM to each area's total catch by fleet and LL CPUE
- Estimate quarterly biomass, fishing mortality, (with and without recruitment deviates)





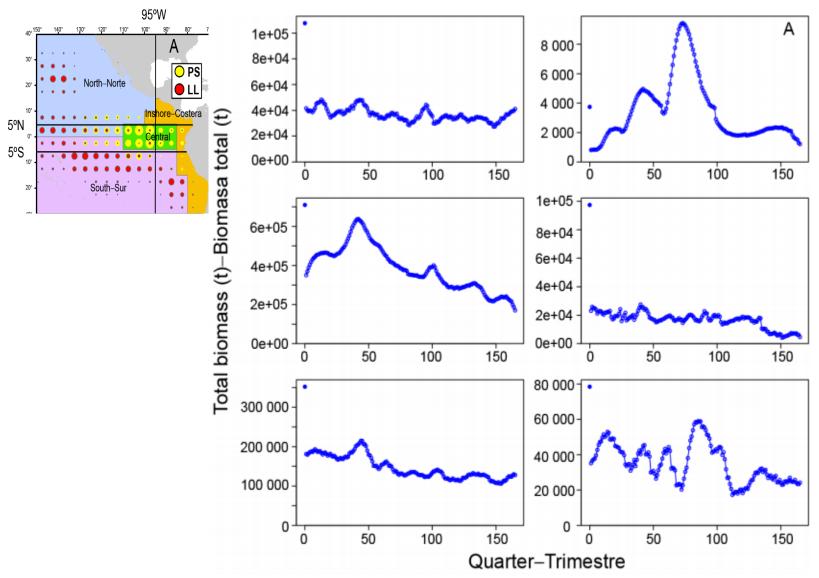
 Initial runs without recruitment deviates produce poor fits to the longline CPUE





- Runs with recruitment deviates produce better fits to the longline CPUE
- Recruitment is driving abundance more than catch is. Problematic when relying on the effect of catch on CPUE to inform absolute abundance

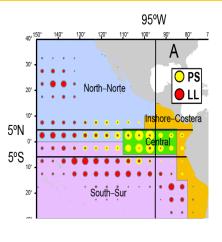


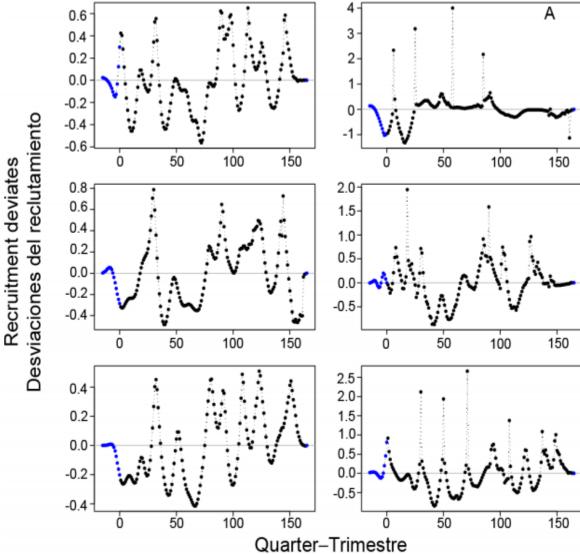


#### **General ASPM results**

- Largest estimated biomass declines in Equatorial areas
- Some area combinations have too sparse data for meaningful results
  - Fewer areas and alternative divisions





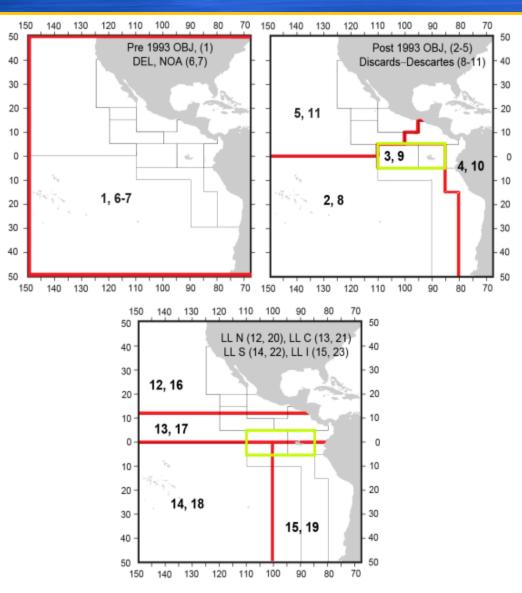


#### **General ASPM results**

- Two-regime recruitment pattern
  estimated in several area combinations
- Recruitment pattern is independent of length compositions, which are not used in the ASPM



### Integrated model

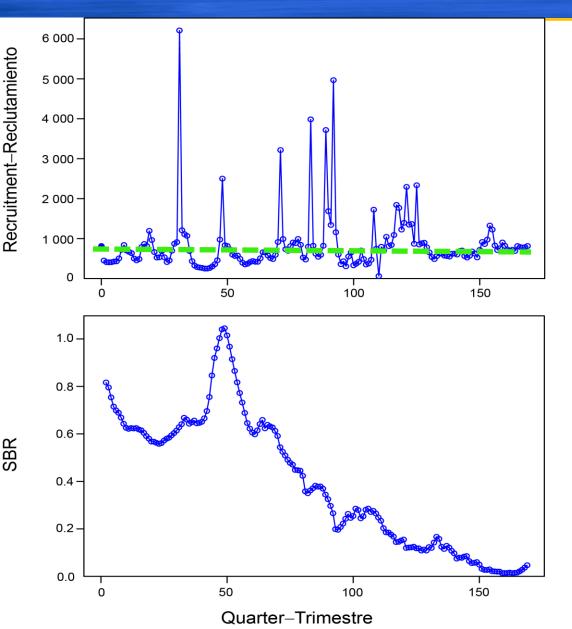


Similar to BET base model but restricted to the Central Area, where the increased purse-seine catch occurred

- Fisheries redefined on spatial overlap with Central area
- Only post-1993 catch and length-composition data were used, prior to 1993 there no spatial overlap with the Central area
- Three alternative weightings of the composition data:  $(\lambda = 0.05, \lambda = 1, \text{ and Francis (2011) iterative weighting)}$

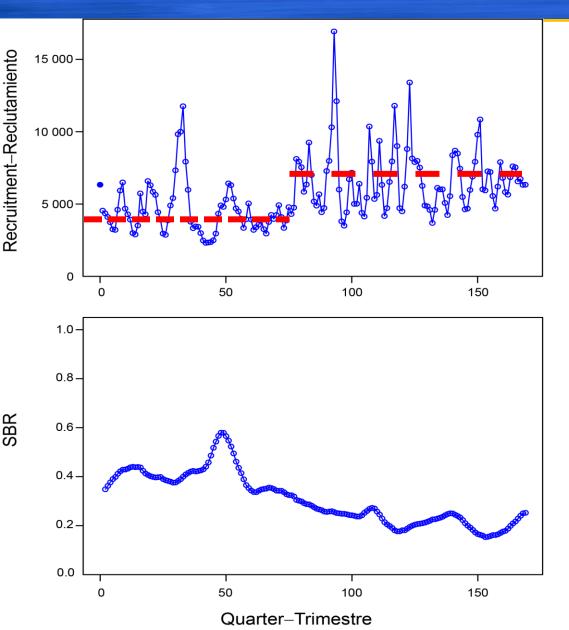


# Integrated model (Central area)



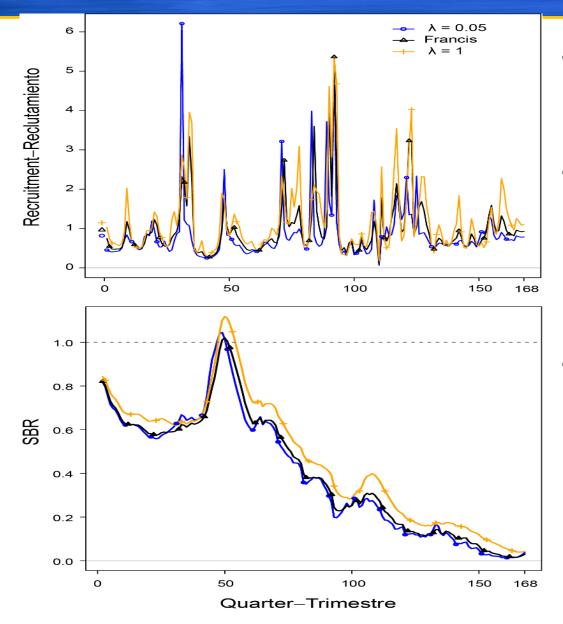
- The integrated model estimates a steeper declining trend in the spawning biomass ratio (SBR), and a more depleted stock status in the Central area than is estimated by the base case stock assessment for the whole EPO
- Recruitment estimates for the Central area do not show the two-regime pattern typical of previous models
- Results are consistent with those of Aires-da-Silva and Maunder (2010)

# Integrated model (Base case SAC 08)



- The integrated model estimates a steeper declining trend in the spawning biomass ratio (SBR), and a more depleted stock status in the Central area than is estimated by the base case stock assessment for the whole EPO
- Recruitment estimates for the Central area do not show the two-regime pattern typical of previous models
- Results are consistent with those of Aires-da-Silva and Maunder (2010)

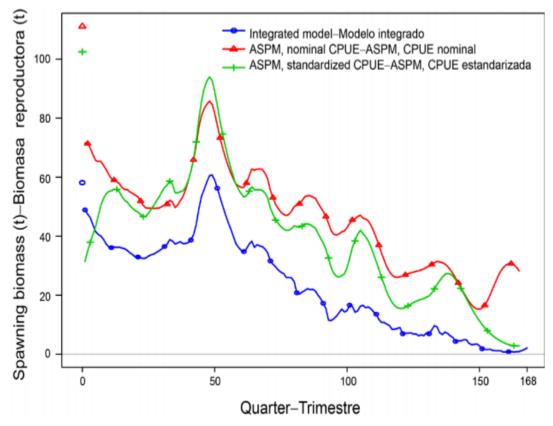
# Integrated model (Central area, data weighting)



- Alternative length-composition data-weighting does not change overall results in the Central area model
- In contrast, length-composition data are down-weighted ( $\lambda$ =0.05) in the base case assessment. Upweighting ( $\lambda$  =1) worsens the two-regime pattern and leads to a more pessimistic stock status
- Francis (2011) method suggests increasing  $\lambda$  for all fisheries, to around 0.5 for purse-seine fisheries and to between 0.8 and 2.5 for longline fisheries



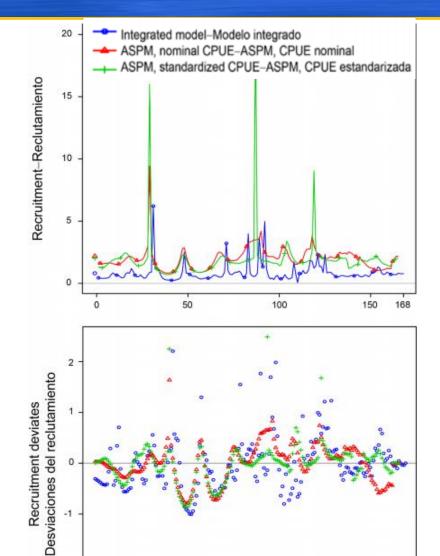
### Comparison between Integrated model and ASPM



 Declining biomass trends are similar between the Integrated model and ASPM (both with and without standardization), the biomass scale is lower for the Integrated model



### Comparison between Integrated model and ASPM



Quarter-Trimestre

- Although the two-regime pattern is not evident in the integrated model, it is evident in the ASPM, whether standardized or nominal CPUE is used
- Using smaller areas to resolve the spatial mismatch between purse-seine catches and longline CPUE may be only partially successful unless length-composition data are included



#### Conclusions

• Spatially disaggregating the BET assessment removes the recruitment two-regime pattern, consistent with the spatial mismatch hypothesis

• The **two-regime pattern seems to be an artifact** of treating the EPO as a single homogeneous area when in fact there are **localized dynamics** of the stock and the fisheries that should be taken into account to remove model misspecification

Alternative spatial management measures should be evaluated for BET in the EPO



#### Future Work

- Spatial model configurations based on:
  - Multivariate regression tree analyses on length distributions and CPUE
  - Mismatch between the spatial distribution of purse-seine and longline fisheries
  - Tagging data (both for defining areas and estimating movement rates)
- Alternative standardization of CPUE indices
- Pacific-wide assessment with SPC
- Better understanding of BET **spatial structure** and dynamics will improve not only stock **assessments**, but also operating models for **ongoing MSE** work.





# Questions

