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FUTURE Session - PICES 25<sup>th</sup> Annual Meeting
San Diego CA
11 Nov 2016





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#### The need

Successful, integrated resource management depends on understanding the spatial distribution of natural resources.

Understanding how resources are distributed relies on model forecasts (i.e., predictions).

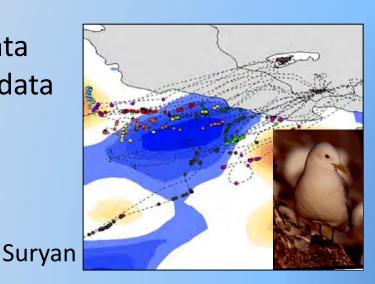
Need forecasts for both tactical (short-term, management) and strategic (long-term, policy) applications.

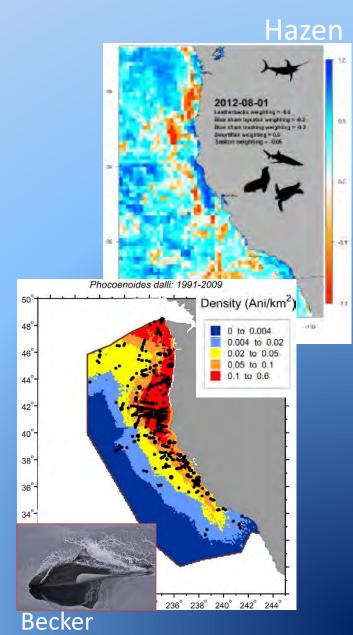
## Leading edge HTL habitat models

- Tactical models for dynamic ocean management
- Process studies of habitat

#### Big Data:

- ROMS models
- RS data (several flavors)
- Catch data
- Tagging data





### Habitat models for other species, places

#### Observational data

- Presence only data (rare, cryptic species)
- No tagging, no surveys
- No population estimates

#### **Environmental data**

- No ROMS models
- RS data poorly resolved/contaminated (i.e., coastal zone)

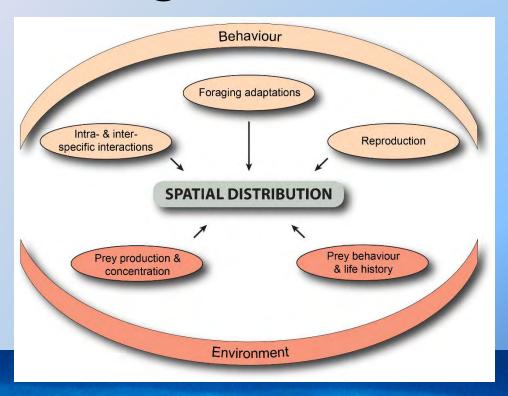


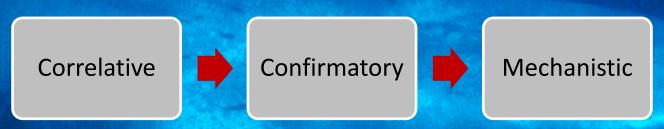
### Methodological challenges

- Biased data
- Sufficiency of model scope
- Non-stationarity
   process(es) underlying observed patterns are
   constant across space and time.
- Cross-validation tests widely used, but do not inform transferability (forecast skill).
- Forecast skill depends on how well models predict independent data.



## Behavior begets non-stationarity



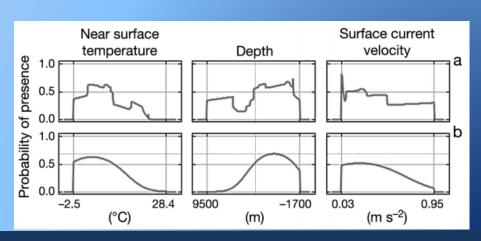


Palacios, Baumgartner, Laidre, Gregr. 2013. Beyond correlation: integrating environmentally and behaviourally mediated processes in models of marine mammal distributions. ESR 22:191-203.



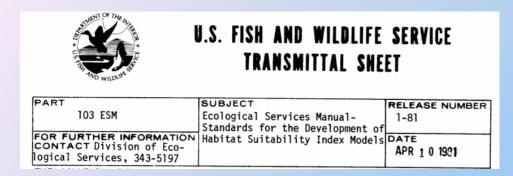
### From correlation to process

- Correlative models may not always lead to process.
- Sophisticated pattern matching approaches can generate ecologically meaningless relationships.
- Model forecasts need to be rooted in ecology.
- Directed studies required to understand process in different behavioral (physiographic) contexts.





#### **Process models**

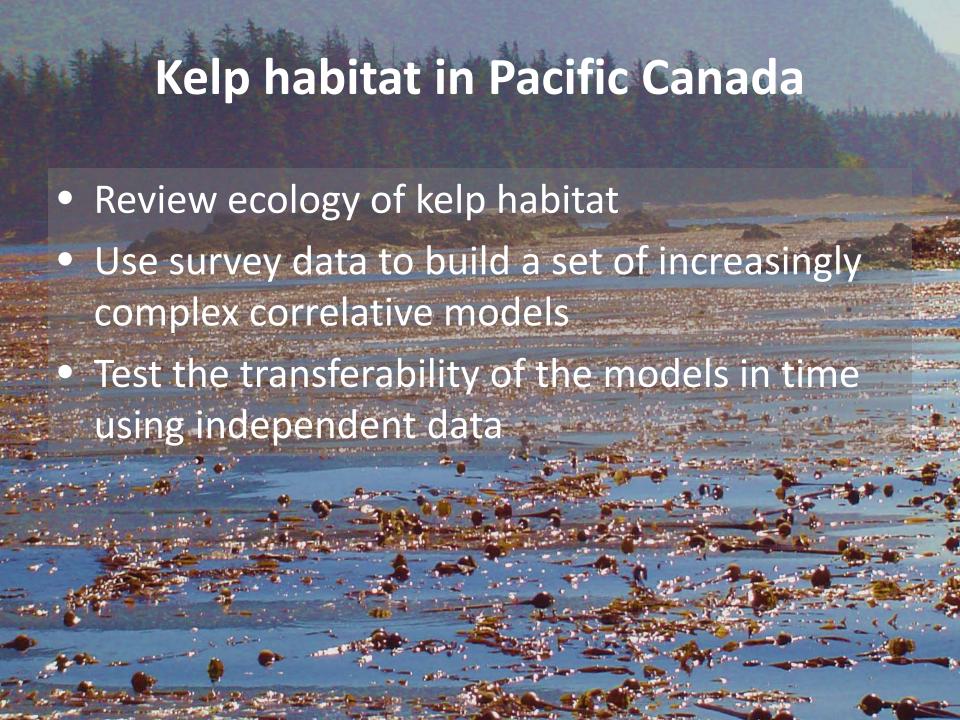


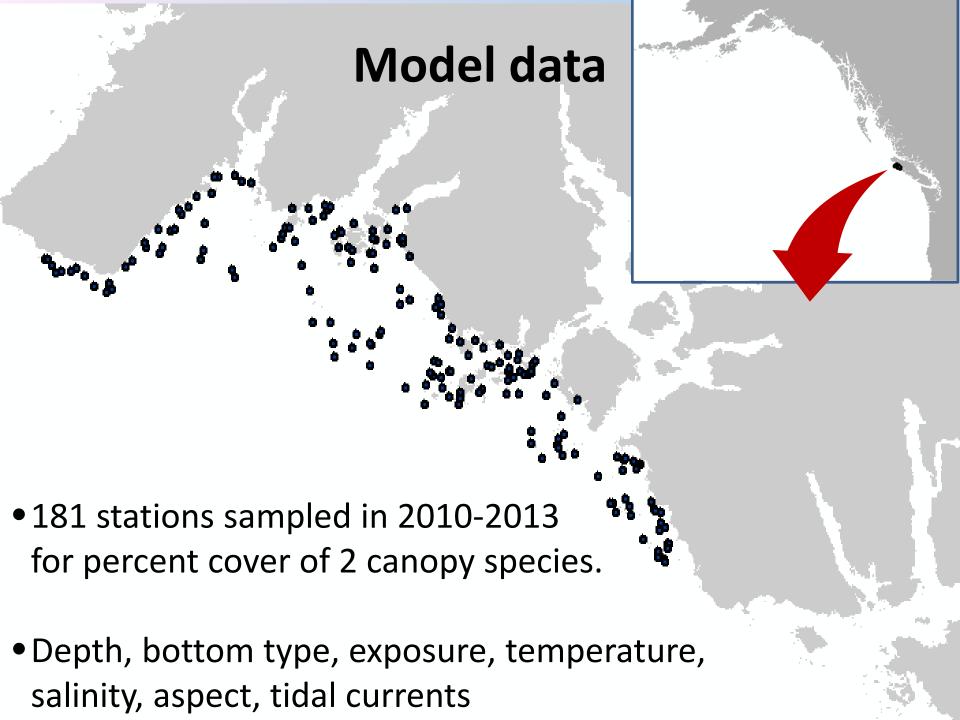
Habitat Suitability Index (HSI) articulated 35 years ago.

"Models should be viewed as hypotheses ...
rather than proven cause and effect
relationships. Value is as a basis for improved
decision-making & increased understanding
... because they specify hypotheses that can
be tested and improved."



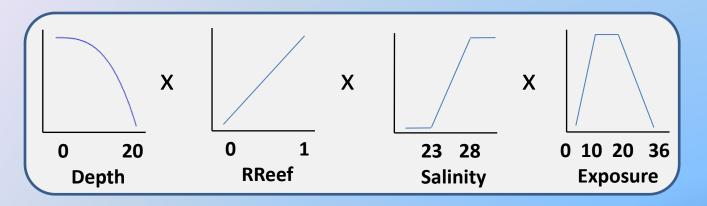
How do correlational studies improve on these simpler, process-based models?





## Models

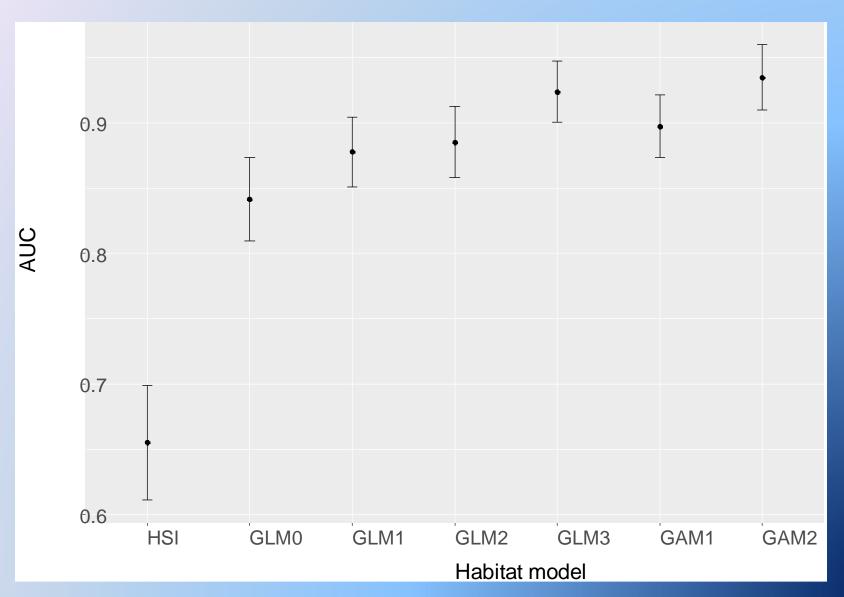
**HSI** 



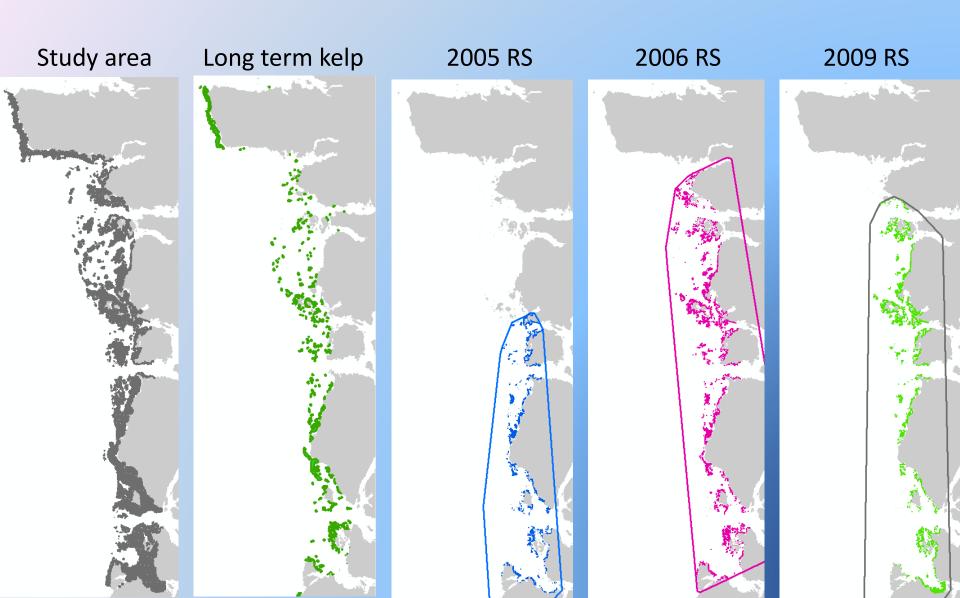
	Model Scope	AIC	$\Delta \mathbf{D}$
	GLMs		
GLM0	Same as HSI		
GLM1	GLM0 with potential for higher order terms		
GLM2	Addition of other significant predictors		
GLM3	Exploration of potential interactions		
	GAMs		
GAM1	Replication of GLM3 in a GAM context		
GAM2	Extension of GAM1 to a maximum level of smoothing		

#### **Model cross-validation**

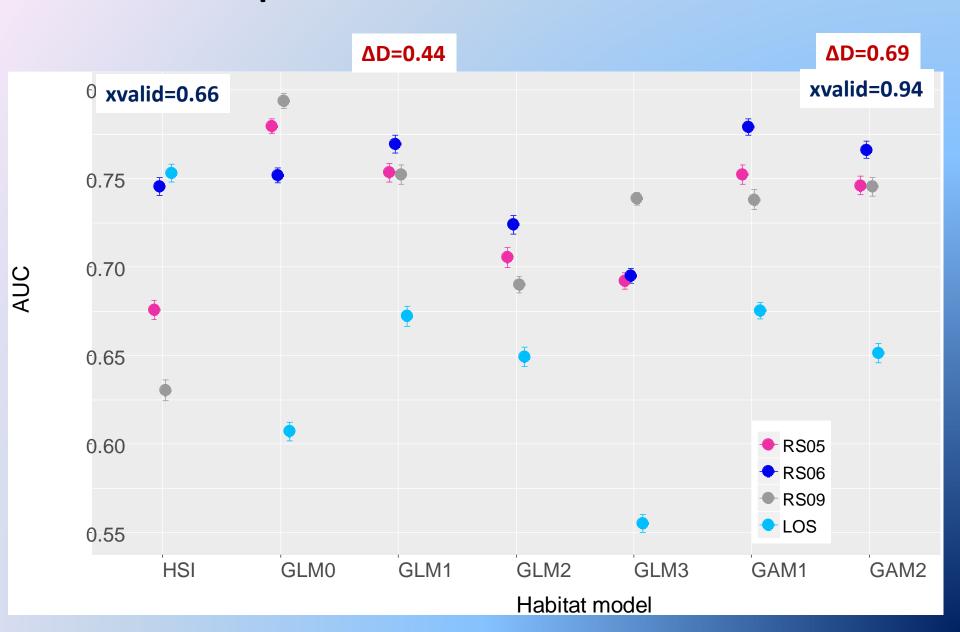
(Uses survey data on which the regression models were built)



# Independent data



# Independent data validation



# Take home messages

 Independent data evaluation is a more accurate test of forecast skill than cross-validation

 Simpler models likely better for strategic (potential habitat) forecasts than more complex ones

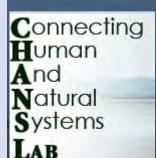
 Simpler models provide more guidance on process, and improve model credibility

#### What about FUTURE?

- Movement towards process-based, context dependent models encouraging.
- Credibility will be enhanced by more independent data validation.
- Models must also be relevant, legitimate.

Cash et al. 2003: Knowledge systems for sustainable development. PNAS 100(14).

Legitimacy will be enhanced by indicators people care about, at scales that matter.



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