# Predicting herring distributions during winter

Jed Macdonald<sup>1</sup>, Kai Logemánn<sup>1</sup>, Elias Krainski<sup>2</sup>, Þorsteinn Sigurðsson<sup>3</sup>, Geir Huse<sup>4</sup>, Colin Beale<sup>5</sup>, Solfrid Hjøllo<sup>4</sup>, Guðrún Marteinsdóttir<sup>1</sup>

<sup>1</sup> MARICE, University of Iceland, Reykjavík, Iceland
<sup>2</sup> Department of Mathematical Sciences, NTNU, Norway
<sup>3</sup> Hafrannsóknastofnun, Reykjavík, Iceland
<sup>4</sup> Institute of Marine Research, Bergen, Norway
<sup>5</sup> Department of Biology, University of York, York, UK



Rannsóknasjóðs síldarútvegsins



## Collective learning and sociality

M

# Atlantic herring (Clupea harengus)

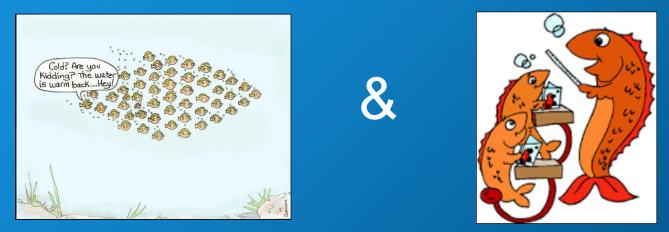
# Atlantic herring (Clupea harengus)

Conservatism (Jakobsson 1969; Corten 1993, 2002)

# **Conservatism defined...**

Habits

Traditions



Younger fish learn traditional migration routes from older ones and these are remembered.

Disruption of learning opportunities can trigger a distribution shift.

# Why and when but...

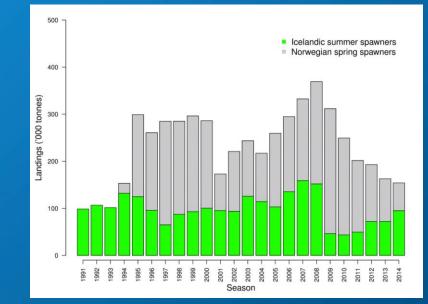
# Can we predict *where* herring will spend the winter?

Photo: George McCallum

# Icelandic summer spawners (ISS)

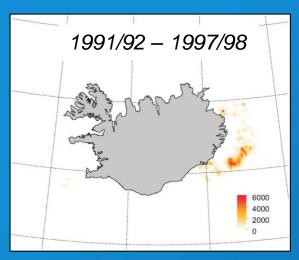
- Major fishery in Icelandic waters.
- Age 3+ adults targeted from October to January each year.



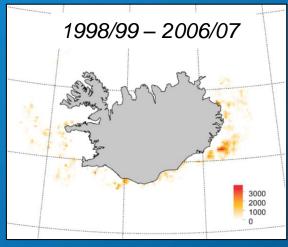


- Purse-seine, pelagic trawl.
- Fishing season follows the summer NSS / mackerel fishery.

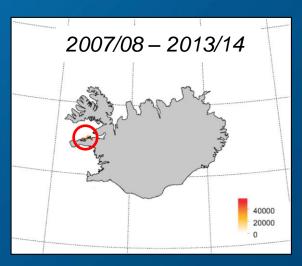
# Shifting winter distribution (Óskarsson et al. 2009)



### Offshore off east coast



# Offshore off east and west coasts



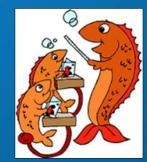
Inshore in small fjords on the north coast of Snæfellnes Peninsula

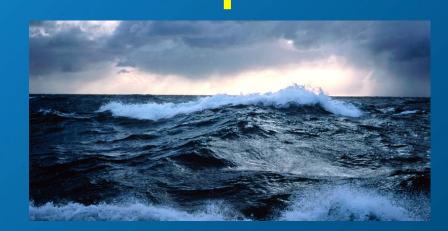
# A model for wintering herring

#### Habits

# Cold? Any you Kidding? The water

#### Traditions





&

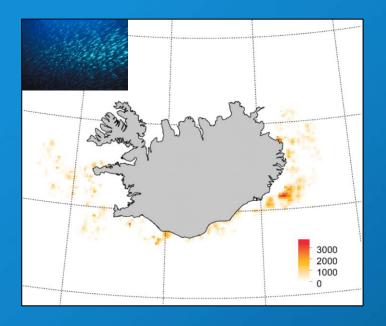




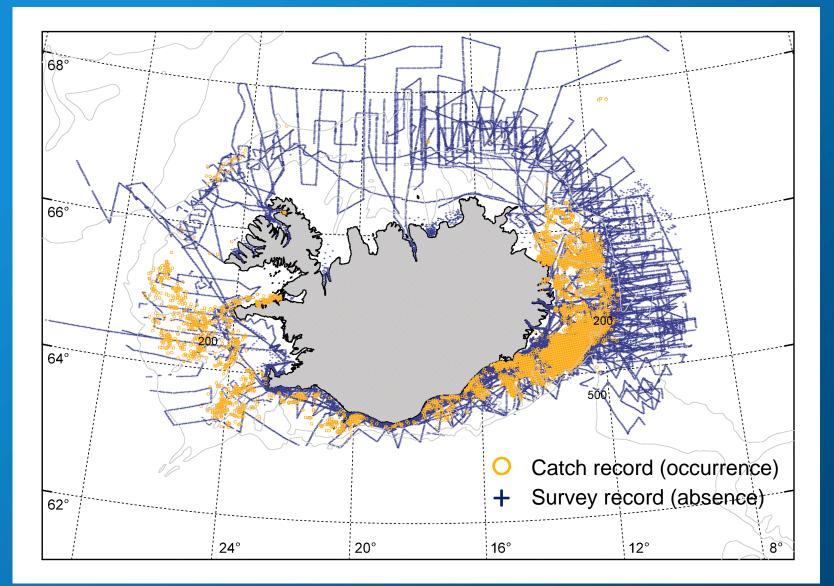
and the states



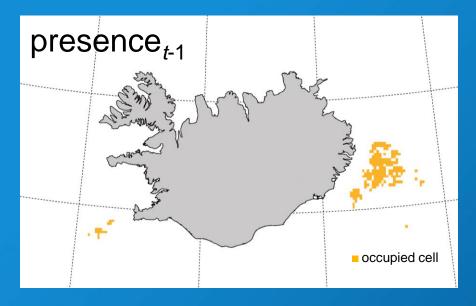
### Winter distribution

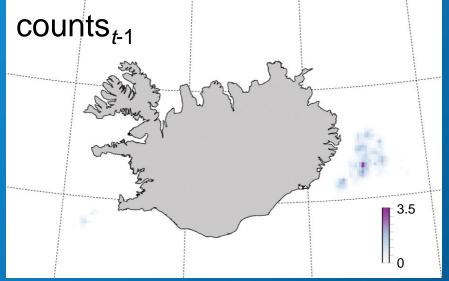


# Fishery and survey records – 23 years



# Habits and traditions





Describes the occurrence pattern of the stock the previous season (*t*-1).

Describes the number of occurrence records in *t*-1.

# **Environment, predators and prey**

Temperature

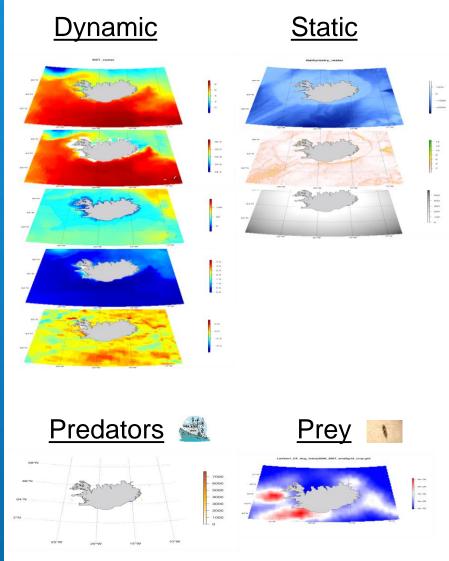
Salinity

#### Stratification

Temperature gradient

Current velocity

Fishing intensity in prev. week

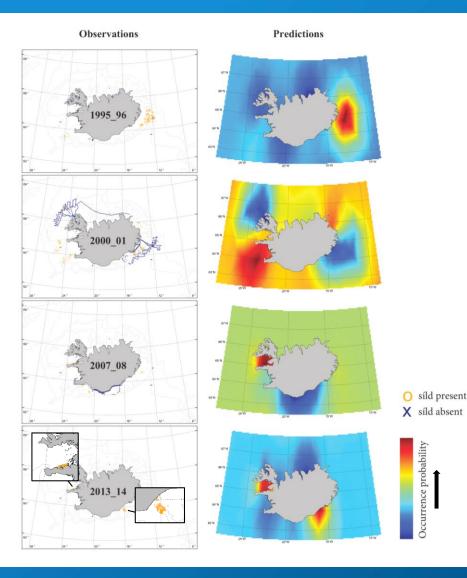


Bottom depth Bottom slope Distance to shore Sources - CODE - GEBCO - Fishery logbooks - Hjøllo et al. 2012

Zooplankton biomass in prev. August

# **Results – spatial predictions**

currence probability



Models accurately predicted the observations for each year of the time series...

Both in years when the wintering area stayed the same.

✤ And, when the distribution shifted to a new location.

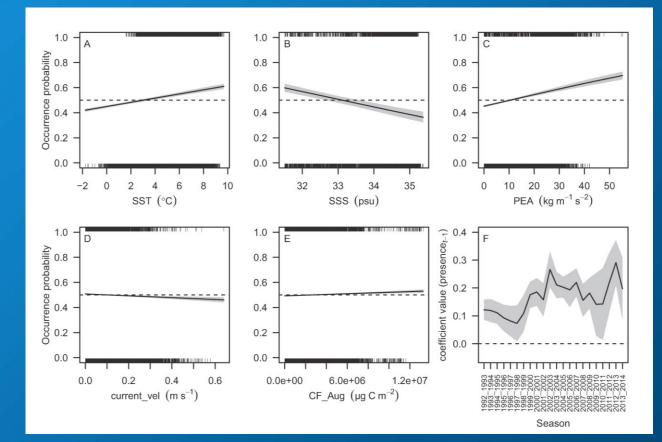
# **Results – covariate influence**

✤ Warmer

Fresher

✤ f stratified

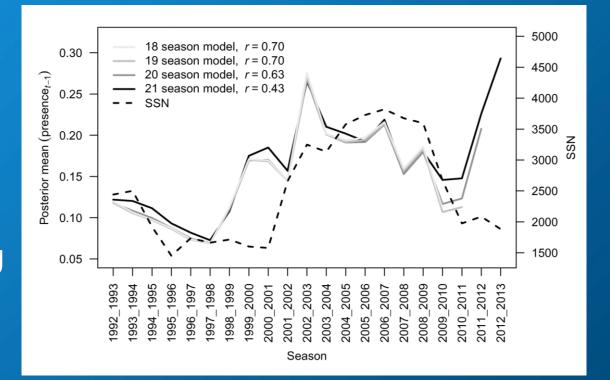
✤↓ velocity



Recent fishing activity and static environment variables had little influence.

# **Results – demographic effects?**

Strong correlation between the population size and the probability of herring returning to the same wintering area.



Suggests that prediction of the winter distribution oneyear ahead is possible...

## **Results – prediction one-year ahead**

Prediction to last four seasons of the time series.

Season	r	cv AUC	cv Brier score
2010_11	0.704	0.961	0.142
2011_12	0.703	0.976	0.137
2012_13	0.631	0.976	0.129
2013_14	0.432	0.588	0.194

Performance was good in three out of four seasons.

Unusual mass mortality events forcing the SSN estimate down, concurrent with strong overlap in fished area b/n 2011\_12 and 2012\_13.

## Discussion

Our model gave highly accurate spatial predictions both within the time series, and to independent observations one-year ahead.

The occurrence pattern of herring in one winter was the best predictor of where they were the next.

Environmental factors (i.e. temperature, salinity, stratification, summer prey avaliability) were also influential.

Attachment to wintering sites increased with adult population size.

# Conclusions

Collective learning often influences decision making in animal societies.

Yet, capturing such phenomena in large-scale spatial models remains challenging.

The models presented here attempt to incorporate these processes in an intuitive, flexible framework.

The approach and predictions can (we hope!) benefit ecologists, fishers and fisheries managers alike.