

# Distribution patterns of squid in the upper epipelagic Gulf of Alaska in winter 2019

*Oleg N. Katugin<sup>1</sup>, Vladimir V. Kulik<sup>1</sup>,  
Mikhail A. Zuev<sup>1</sup> and Svetlana Esenkulova<sup>2</sup>*

1 – Pacific branch of the Russian Federal Research  
Institute of Fisheries and Oceanography (TINRO),  
Vladivostok, Russia

2 – Pacific Salmon Foundation, Vancouver, BC, Canada

*Onychoteuthis borealijaponica*



*Gonatus onyx*



*Boreoteuthis borealis*



*Okutania anonycha*



*Gonatus madokai*



*Abraliopsis felis*



This is how those critters look when they come from the trawl net



# Project Title: Species Identification of Squid

*Richard Beamish*  
*Leon Shaul*  
*Oleg Katugin*

## General Description and Objectives:

Squid are an important component of the diet of salmon in offshore waters of the Gulf of Alaska and Bering Sea and therefore are an integral component of the growth, maturation, and survival of salmon on the high seas.

Maturing epipelagic squid are particularly important in the diet of higher trophic level species (coho, chinook, steelhead), while occupying an important trophic position as intra-guild prey of pink and sockeye salmon. Top-down control of squid by pink salmon has the potential to influence the salmon forage base at different trophic levels as well as growth of other salmon species. The carrying capacity of the offshore Gulf of Alaska for salmon likely varies depending upon specific species and their relationship with squid. Despite their importance, relatively little is known about squid populations on the high seas, including their life cycle, population structure, spawning areas, and movement at different life stages relative to ocean currents.

Genetic samples from squid of various stages will be used as necessary to validate species ID, help confirm the lifespan of a key species found in salmon diets, and begin investigating genetic differentiation within *Okutania anonycha* (also known as *Berryteuthis anonychus*) across the North Pacific and Bering Sea.

**Species ID:** morphology, molecular genetics (CO1)

**Life Cycle:** 1 year vs 2 years in *Okutania anonycha* ???

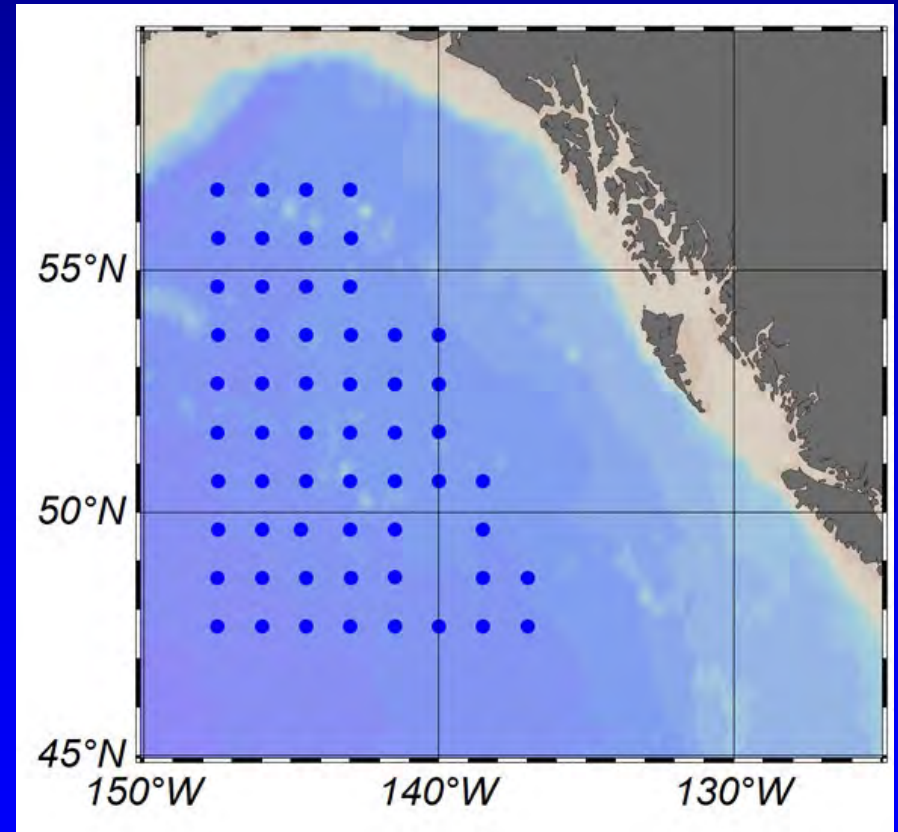
**Genetic Differentiation and Environmental History:** spatial population structure; odd- and even-year lines in *Okutania anonycha* ???

**Collection Protocol:** While *O. anonycha* is likely to be the most dominant species encountered, other species will likely be present including these highly abundant species: *Boreoteuthis borealis*, *Gonatus kamtschaticus*, *Berryteuthis magister*, *Gonatus onyx*, and other Gonatid species

**(1. Surface Trawls: 2. Salmon and other fish Diets:)**

# Research Objectives

- Analyze distribution patterns of cephalopods in the GoA in the early spring 2019 based on the upper epipelagic trawl catches



# Research Objectives

- Take a closer look at the occurrence of highly abundant species in the research area in the upper epipelagic layer, and at species that were expected to occur in large quantities in the GoA
- Use the existing sources of information on distribution of cephalopods in the NPO:
  - (1) TINRO database on trawl catches collected in expeditions
  - (2) GBIF (*Global Biodiversity Information Facility*)—is an international network and research infrastructure with an open access to data about all types of life on Earth.

**gbif.org**

# Research Objectives

- analyze the occurrence of selected abundant and potentially abundant cephalopod species in the NPO with respect to geophysical and biotic factors, which may predict distribution patterns of those species
- Use the Bio-Oracle (Marine Data Layers for ecological modeling) to produce potential habitat for the selected cephalopod species in MaxEnt

**[bio-oracle.org](http://bio-oracle.org)**

# Research Objectives

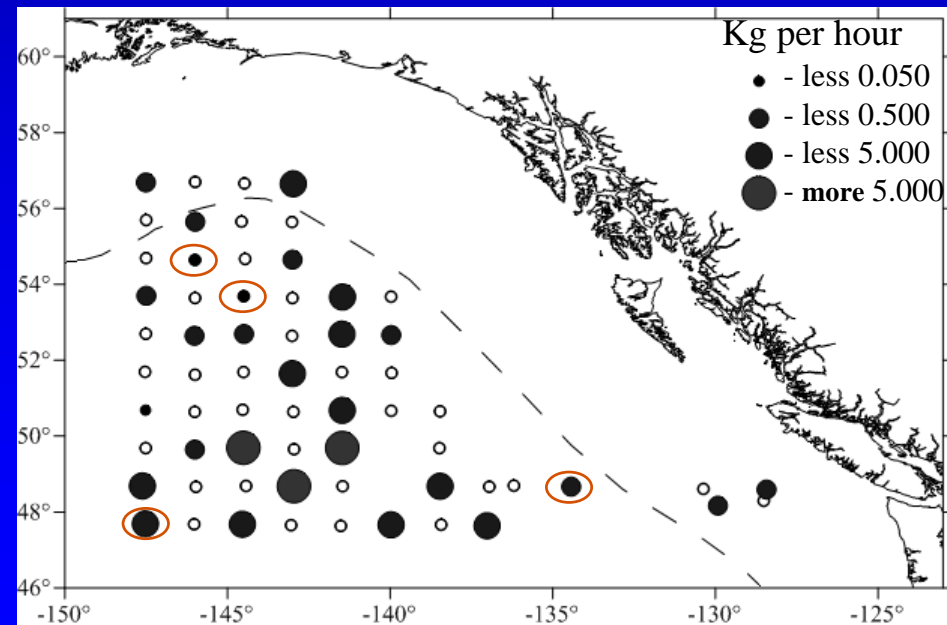
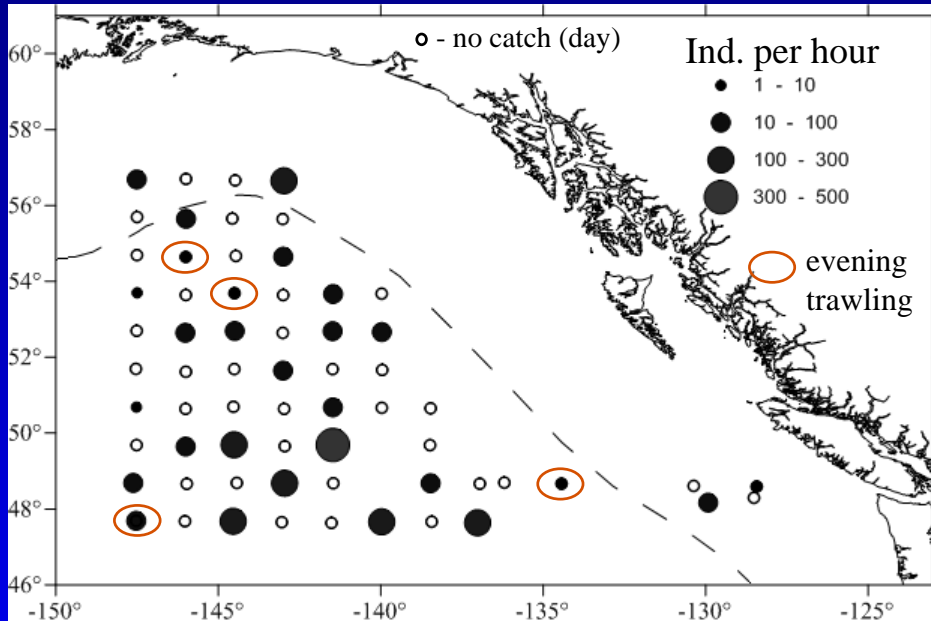
- relate the observed distribution patterns of cephalopods from the trawl survey in the GoA, their occurrence from databases and distribution patterns derived for those species from habitat modeling
- look at the discrepancies between cephalopod distribution patterns from various sources of information
- suggest improvement for data collection to get reliable information on distribution of pelagic cephalopods



# Results from epipelagic trawl survey in the GoA in spring 2019

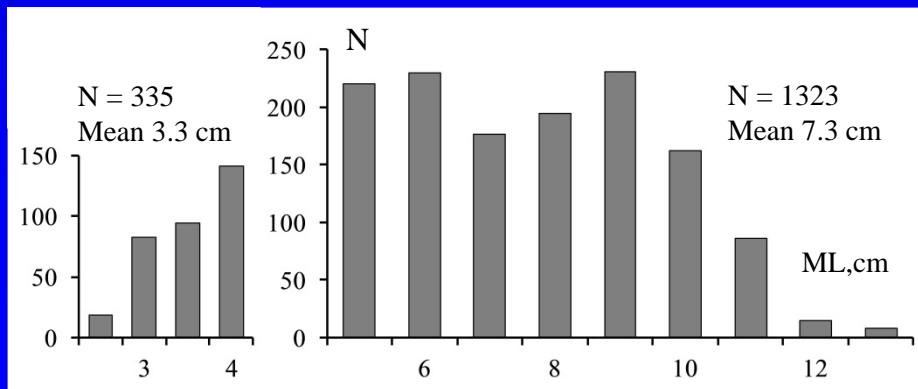
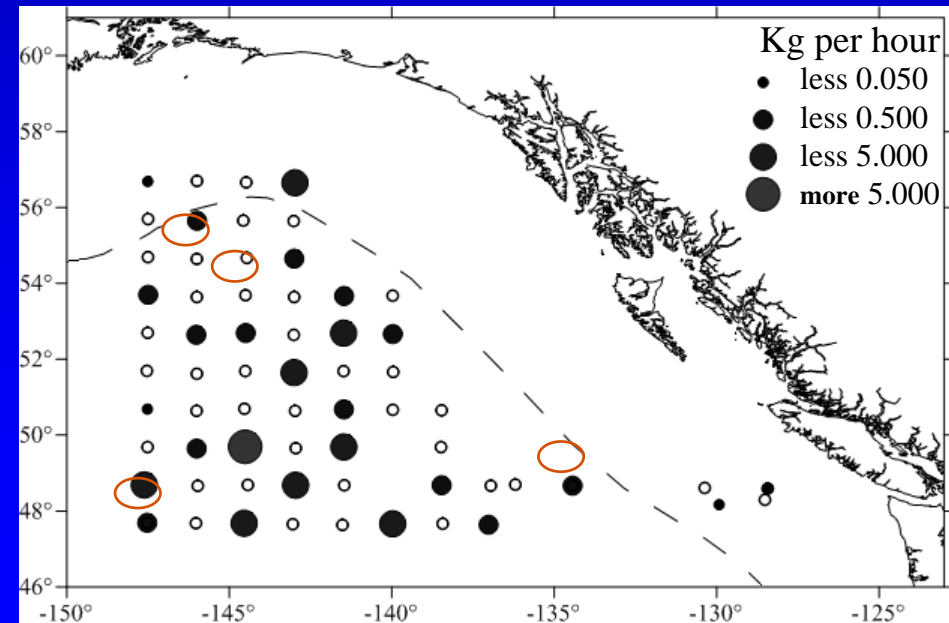
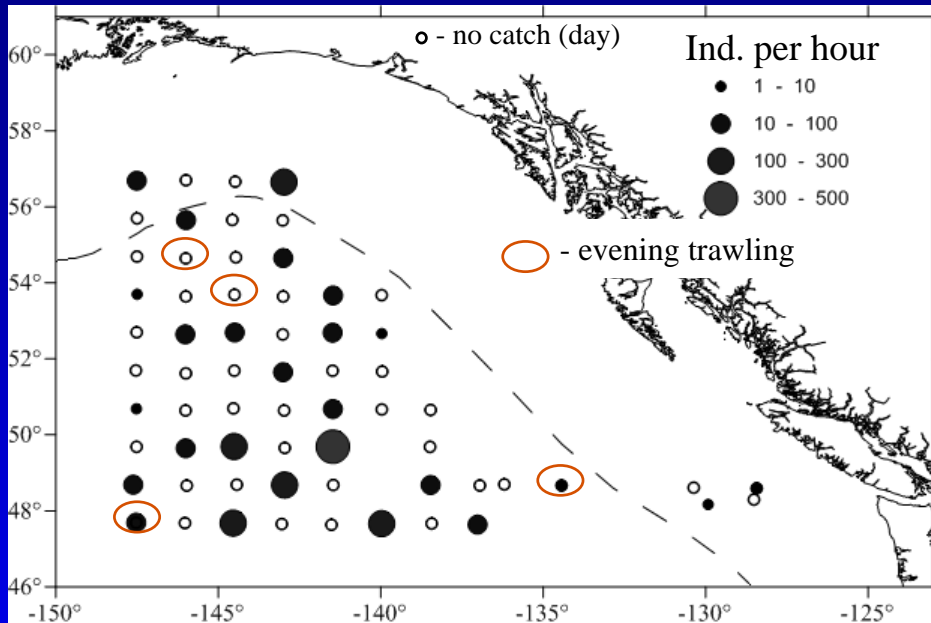
Species	Total occurrence % (64 trawl hauls)	Occurrence at night % (24 trawl hauls)	Occurrence in daytime % (40 trawl hauls)
<i>Boreoteuthis borealis</i>	40.6	100.0	5.0
<i>Gonatus onyx</i>	23.4	58.3	2.5
<i>Gonatus madokai</i>	7.8	16.7	2.5
<i>Okutania anonycha</i> *	6.3	16.7	---
<i>Onychoteuthis borealijaponica</i>	26.6	66.7	2.5
<i>Onykia (=Moroteuthis) robusta</i>	1.6	4.2	---
<i>Chiroteuthis calyx</i>	7.8	16.7	2.5
<i>Abraliopsis felis</i>	7.8	16.7	---
<i>Belonella borealis</i> *	4.7	12.5	---
<i>Japetella diaphana</i>	1.6	4.2	---
* - occurrence in fish stomachs			

# Distribution of cephalopods in the GoA 2019 spring upper epipelagic trawl survey



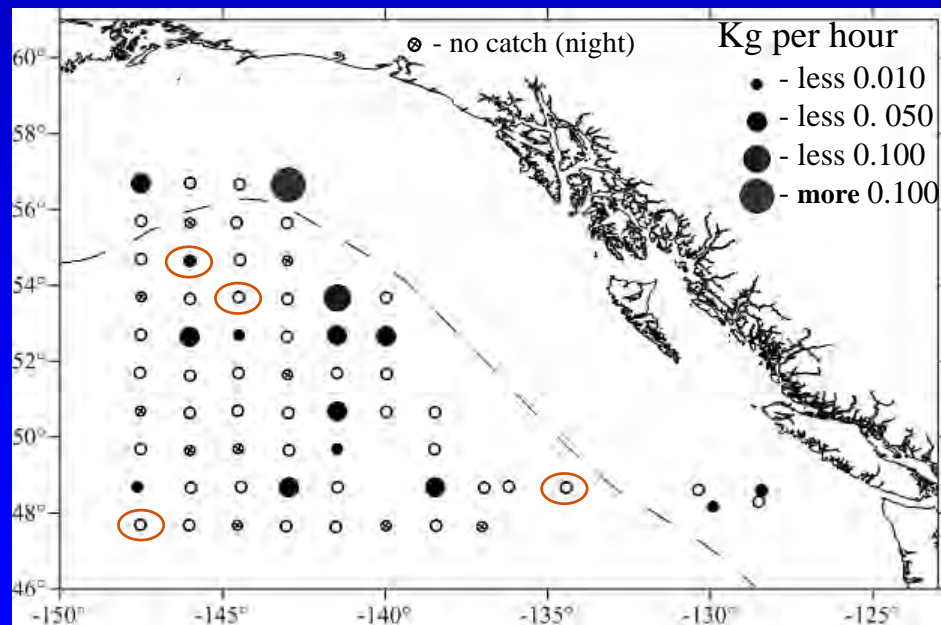
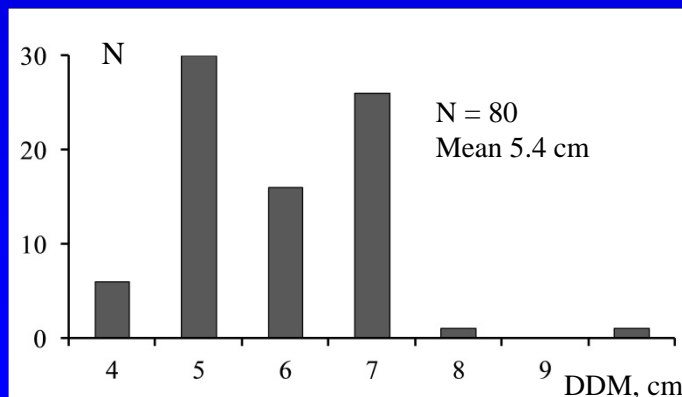
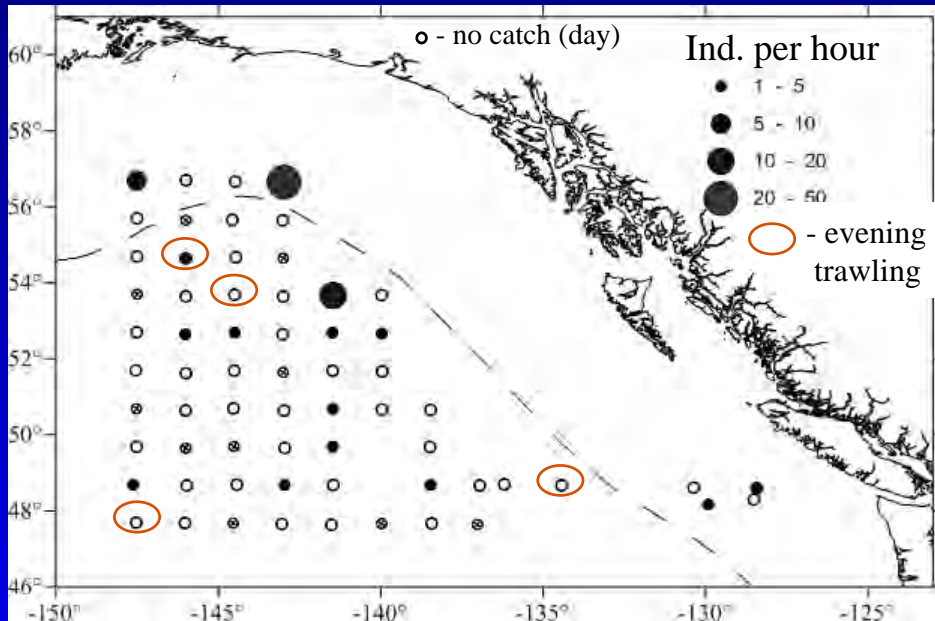
# *Boreoteuthis borealis*

*B. borealis* – abundant and widely distributed across the research area; individuals were mostly young and immature

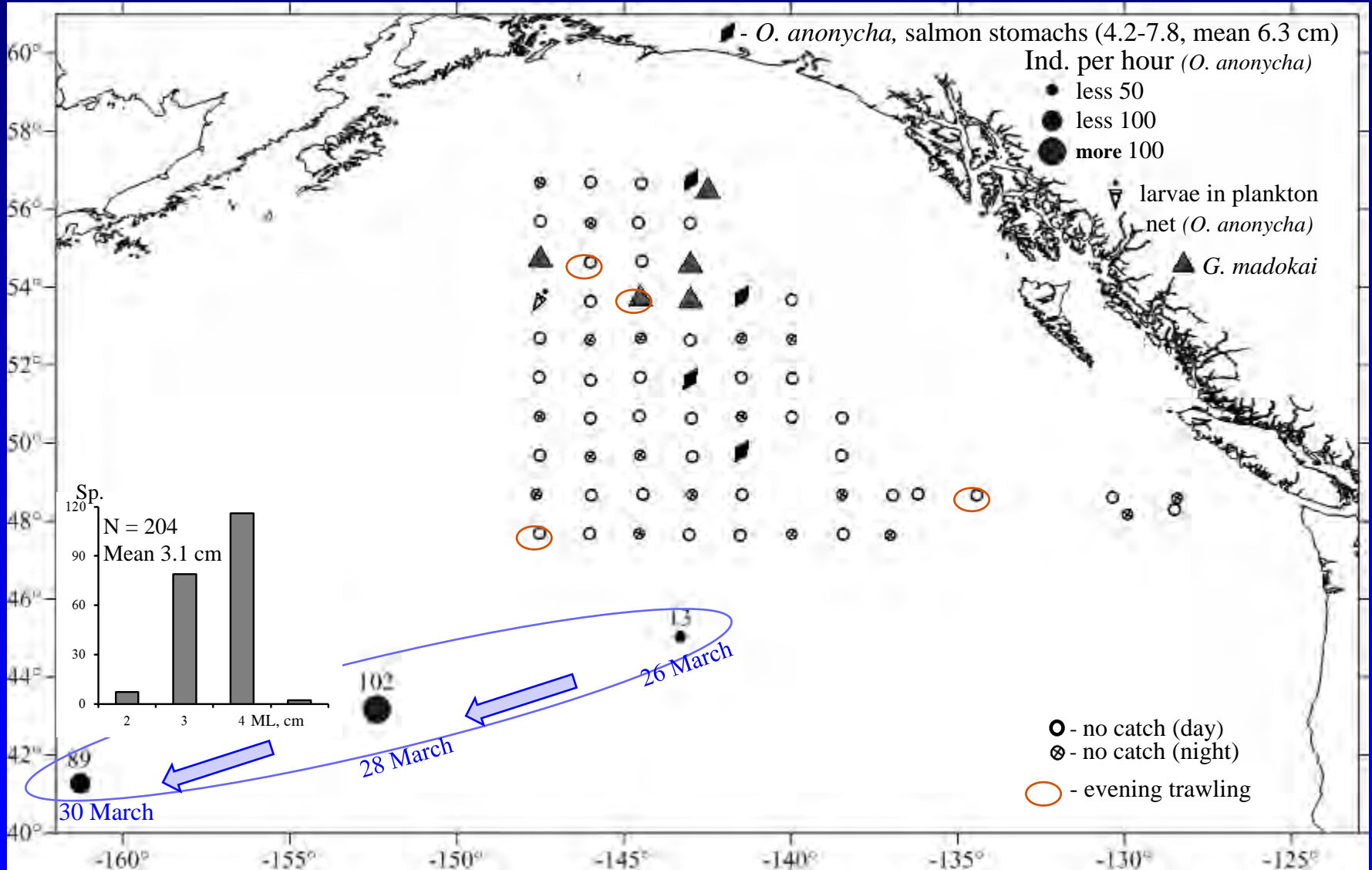


# *Gonatus onyx*

*G. onyx* also occurred widely across the research area (higher numbers in the northern areas); individuals were mostly young and immature

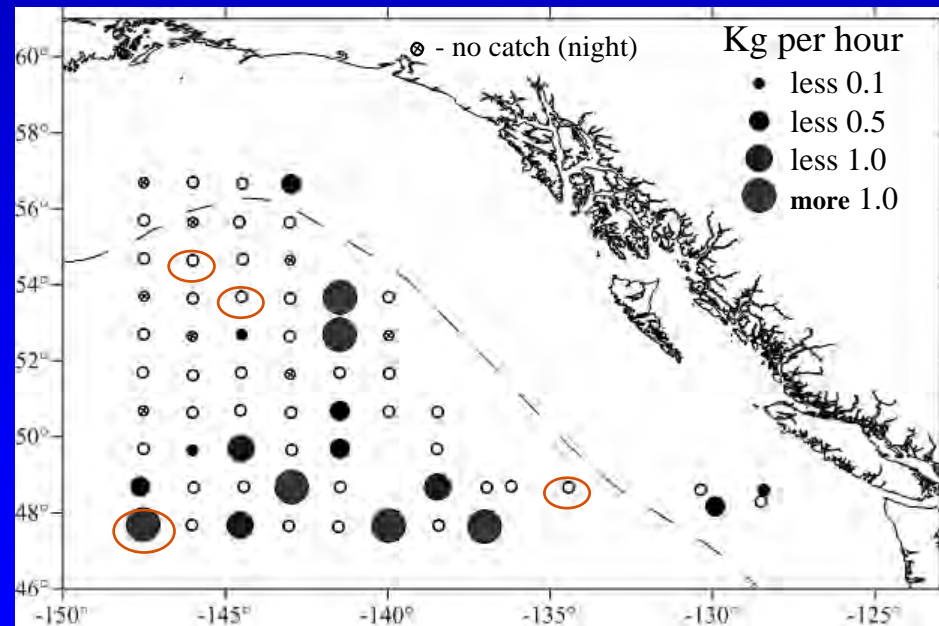
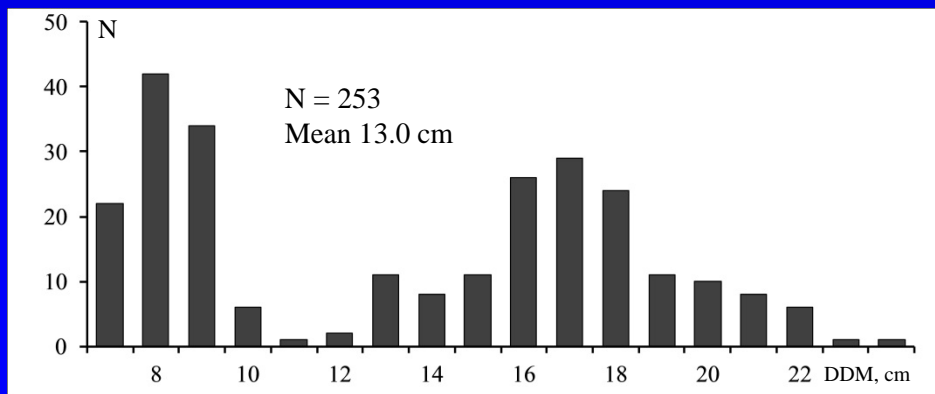
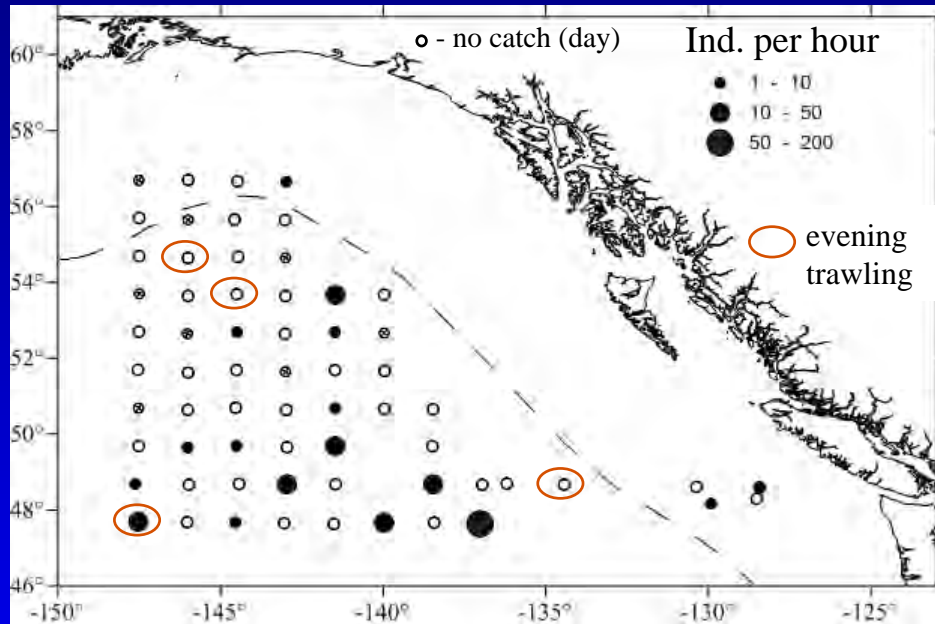


# Okutania anonycha and Gonatus madokai



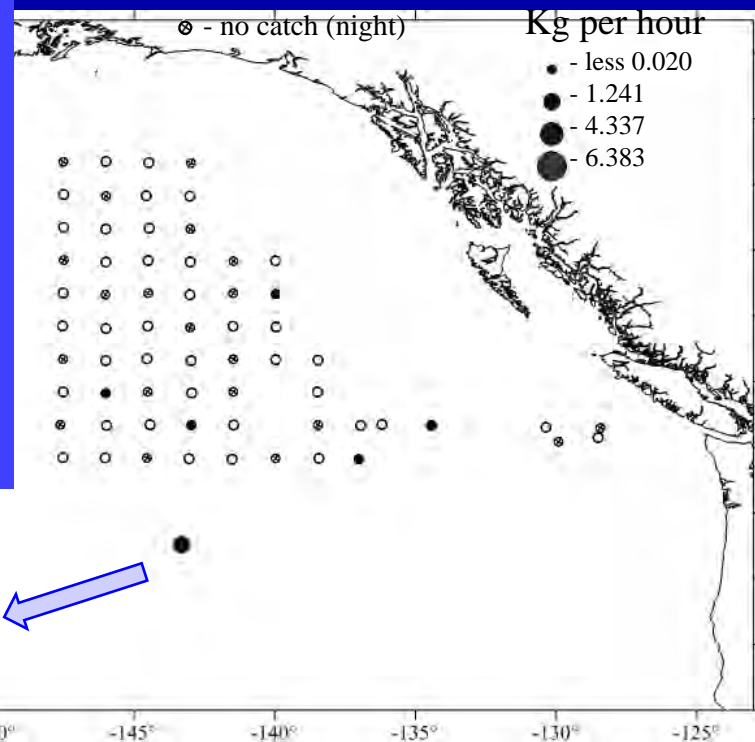
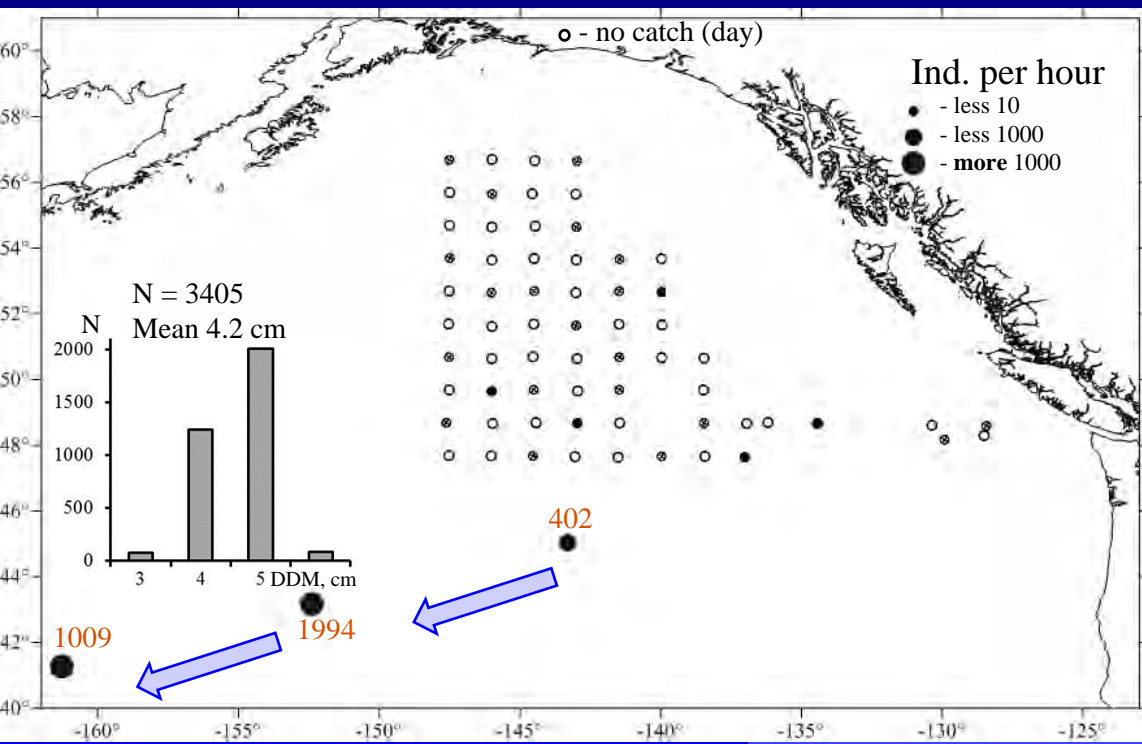
# *Onychoteuthis borealijaponica*

*O. borealijaponica* –  
abundant, widely distributed  
over the research area;  
two size groups



# *Abraliopsis felis*

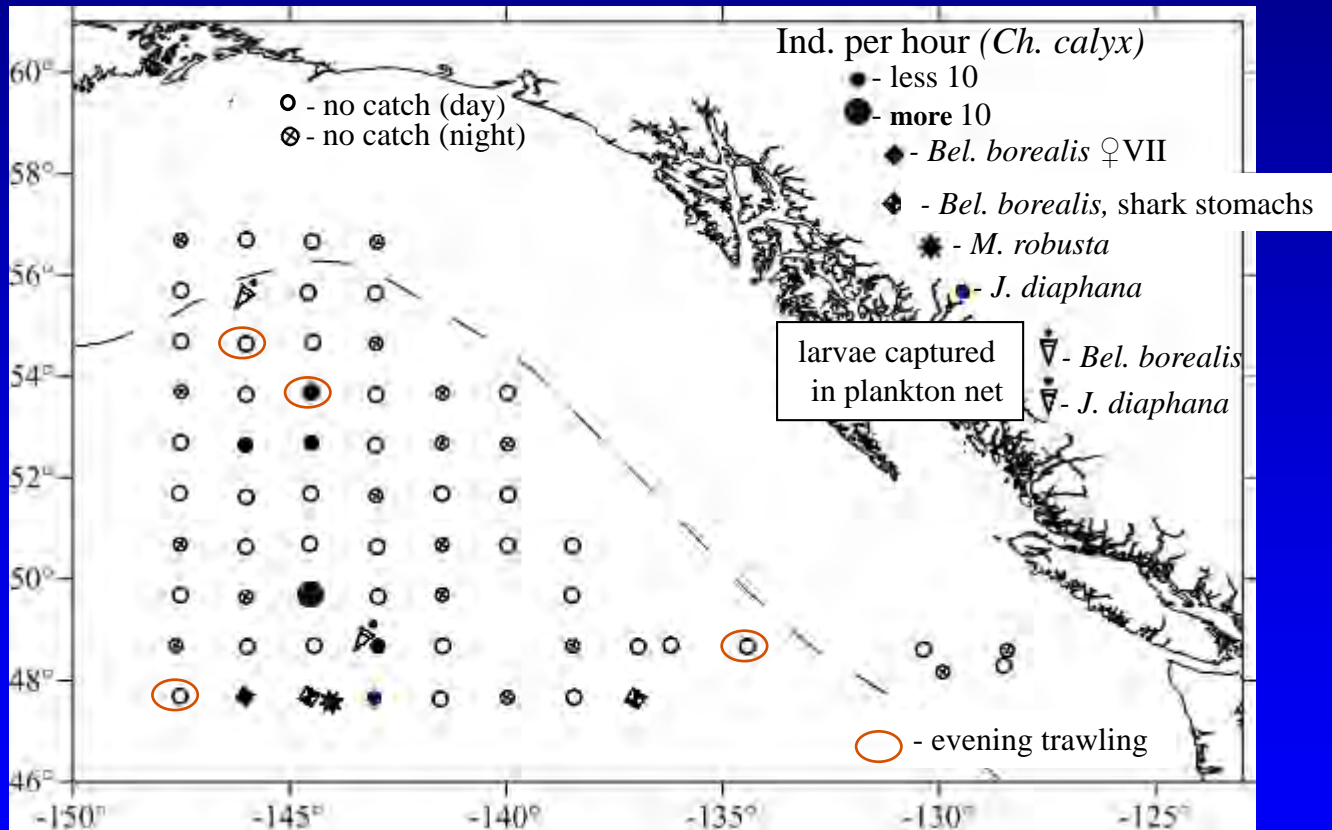
*A. felis* – occasional occurrence over the research area



... higher occurrence beyond the survey area, in the south (on the way back)

# Other cephalopods:

## *Chiroteuthis calyx*, *Belonella borealis*, *Mororteuthis robusta* and *Japetella diaphana*





# What did the survey show us?

- During 2019 spring trawl survey in the GoA, several abundant pelagic squid were encountered
- Some species were regularly captured and in relatively high numbers (*B.borealils*, *O.borealijaponica*), some occurred regularly but in small numbers (*G.onyx*, *A.felis*)
- One potentially abundant species (*O.anonycha*) was absent from trawl catches, and occurred exclusively in salmon stomachs (!!!)

# Abundant Squid Species in the NEP

north Boreal  
cold water  
mesopelagic

south Boreal  
warm water  
epipelagic

family Gonatidae

- *Okutania anonycha*
- *Boreoteuthis borealis*
- *Gonatus onyx*
- *Gonatus madokai*

family Enoploteuthidae

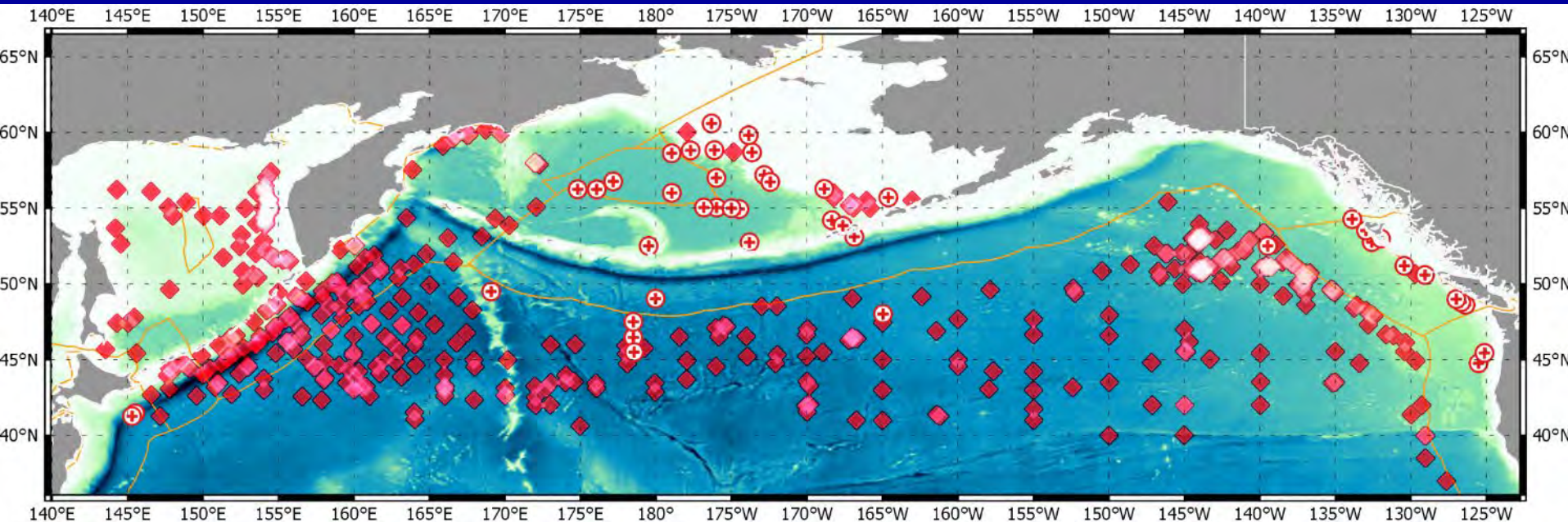
- *Abraliopsis felis*

family Onychoteuthidae

- *Onychoteuthis borealijaponica*

# *Okutania anonycha*

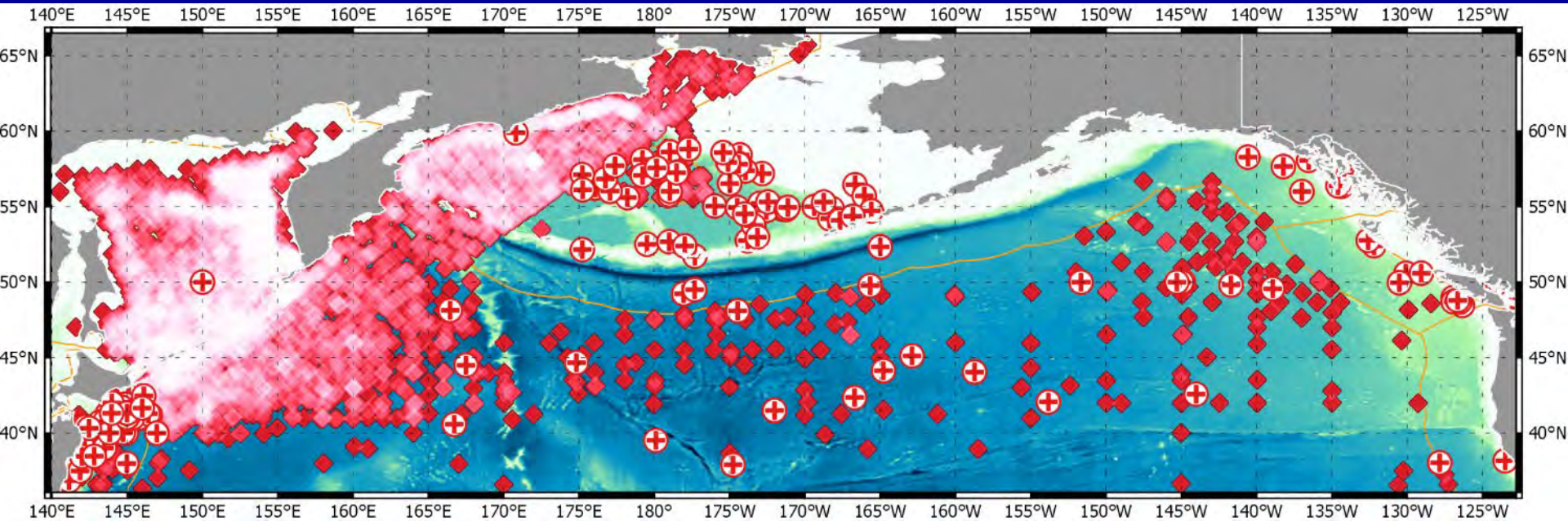
Occurrence based on information from  
TINRO surveys  and GBIF 



- 1) widely distributed across the NPO (boreal waters) with high concentrations in the NWPO and NEPO
- 2) rarely occurred in spring 2019 in GoA (**no catch by surface trawl; rarely occurred in stomachs of sockeye, coho and chinook**)

# *Boreoteuthis borealis*

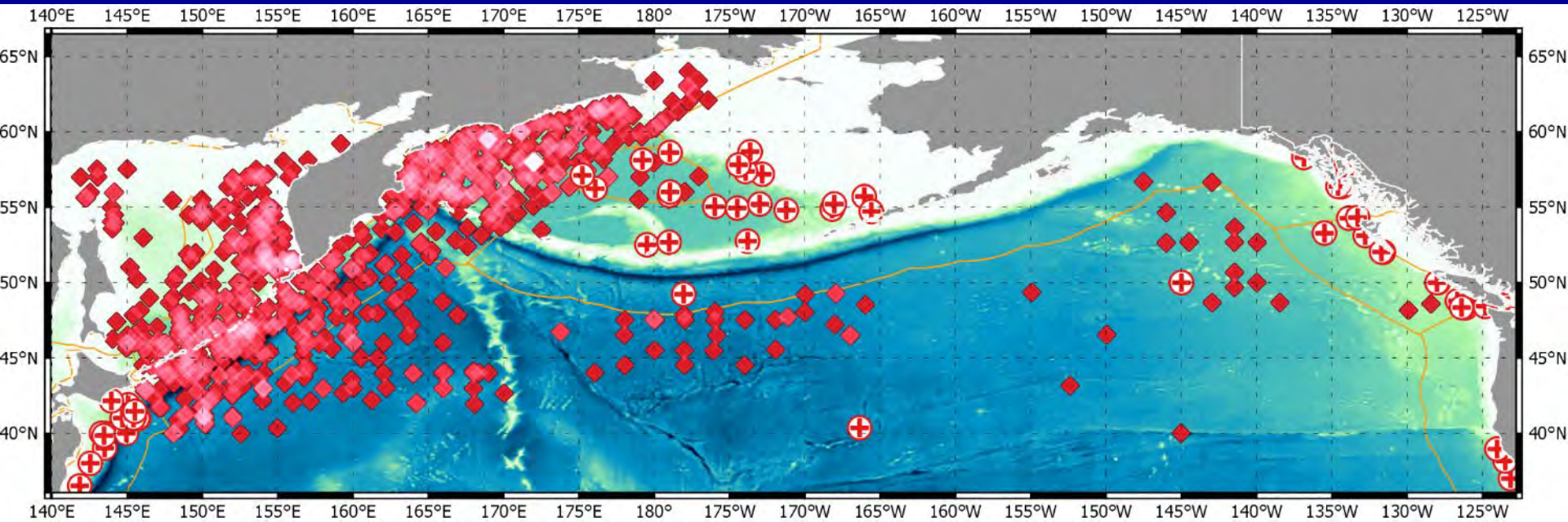
Occurrence based on information from  
TINRO surveys ◆ and GBIF +



- 1) widely distributed in the NPO (boreal waters) with high concentrations across the entire range
- 2) regularly occurred in the 2019 GoA Trawl Survey (in 100% of trawl catches at night; all individuals were immature)

# *Gonatus onyx*

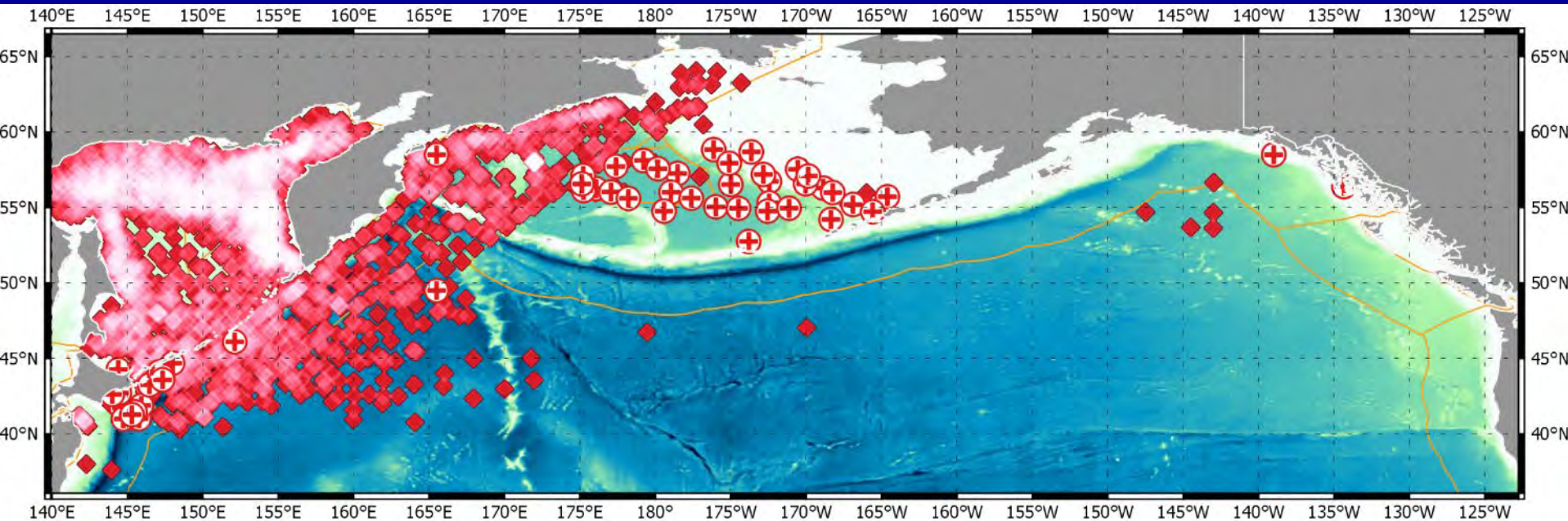
Occurrence based on information from  
TINRO surveys  and GBIF 



- 1) widely distributed in the NPO (boreal waters); occur regularly but without any record on high concentrations
- 2) occasionally occurred in the 2019 GoA Trawl Survey (juveniles and immature; mainly in night hauls)

# *Gonatus madokai*

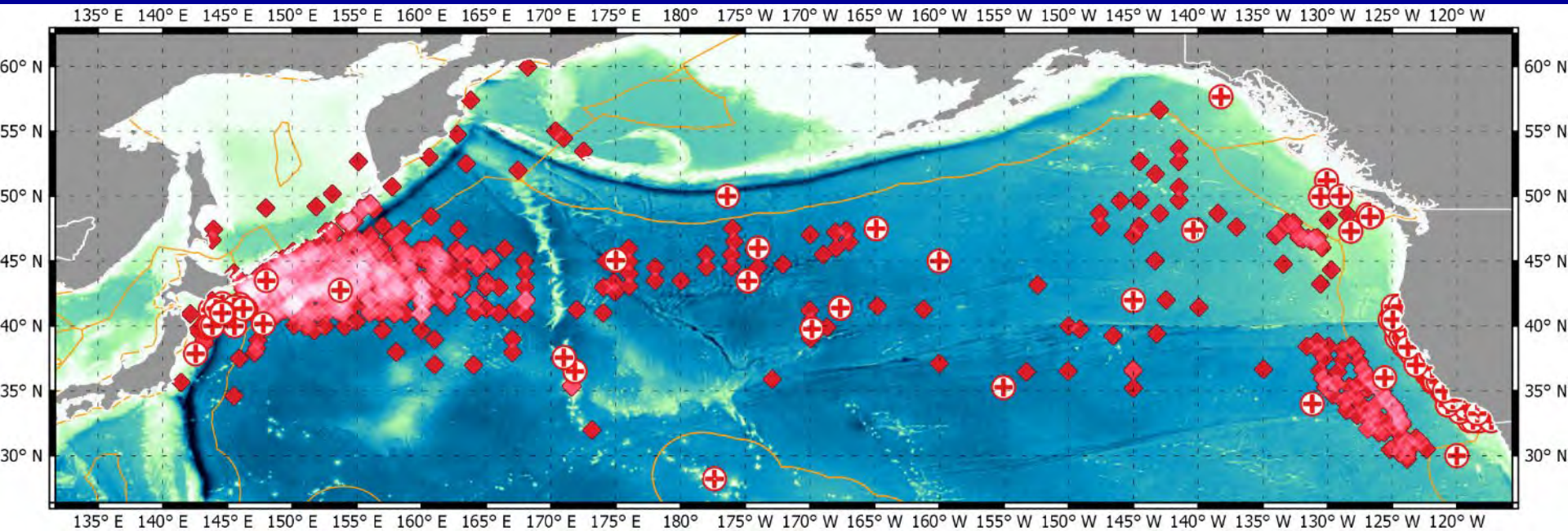
Occurrence based on information from  
TINRO surveys  and GBIF 



- 1) widely distributed in the NWPO (boreal waters); occur regularly;
- 2) occasionally occurred in the 2019 GoA Trawl Survey (juveniles and immature, mainly north of 53N)

# *Onychoteuthis borealijaponica*

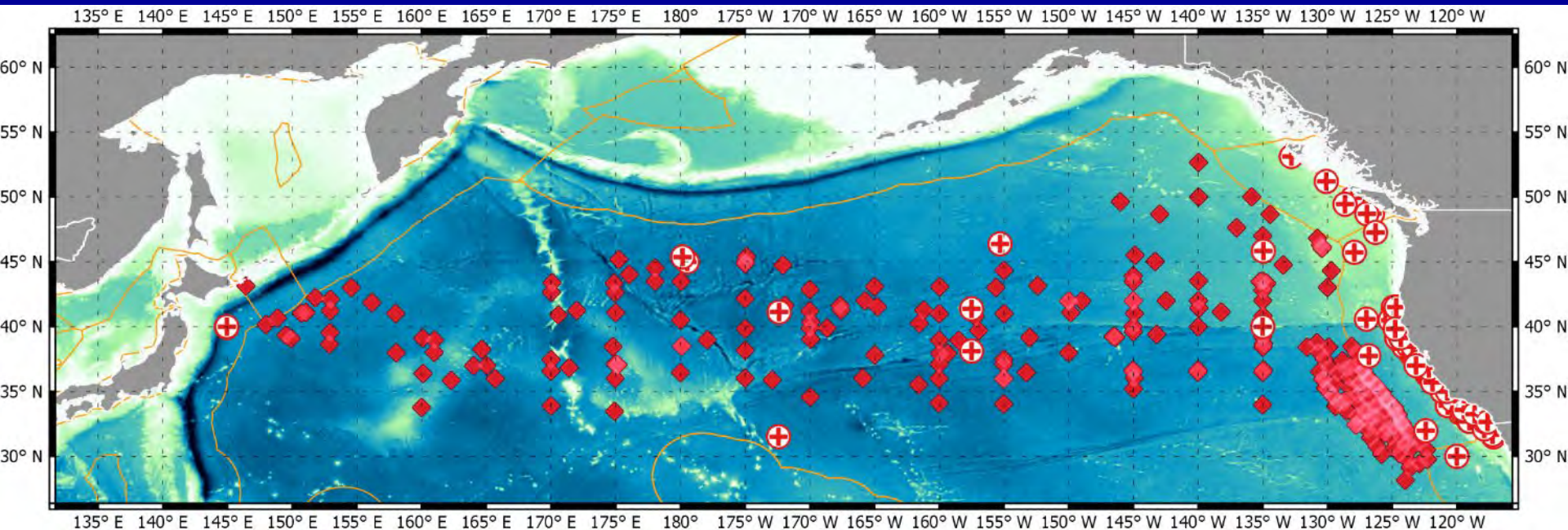
Occurrence based on information from  
TINRO surveys  and GBIF 



- 1) widely distributed in the NPO (lower boreal waters and transition zone); occur in high concentrations
- 2) regularly occurred in the 2019 GoA Trawl Survey (immature and maturing; mainly south of 50N)

# *Abraliopsis felis*

Occurrence based on information from  
TINRO surveys  and GBIF 



- 1) widely distributed in the NPO (subtropical waters and transition zone); occur in high concentrations
- 2) occasionally occurred in the 2019 GoA Trawl Survey (mature!!! occasionally south of 53N)



Layers to download

Layer	Unit	Max	Mean	Min	Lt. Max	Lt. Min	Range
Temperature	°C	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Salinity	PSS	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Currents velocity	m-1	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Ice thickness	m	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Sea ice concentration	Fraction	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Nitrate	mol.m-3	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Phosphate	mol.m-3	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Silicate	mol.m-3	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Dissolved molecular oxygen	mol.m-3	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Iron	umol.m-3	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Chlorophyll	mg.m-3	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Phytoplankton	umol.m-3	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Primary productivity	g.m-3.day-1	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Calcite	mol.m-3	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
pH	-	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Photosynt. Avail. Radiation	E.m-2.day-1	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Diffuse attenuation	m-1	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Cloud cover	%	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>

Select All Layers

\* Lt. for average of the minimum and maximum records

# Geophysical and Biotic Factors

Link squid distribution data to abiotic and biotic factors that is supposed to be associated with squid occurrence

The data available in Bio-ORACLE are documented in two peer reviewed articles that you should cite:

Tyberghein L, Verbruggen H, Pauly K, Troupin C, Mineur F, De Clerck O (2012) Bio-ORACLE: A global environmental dataset for marine species distribution modelling. *Global Ecology and Biogeography*, 21, 272–281.

[access publication] [supporting information]

Assis, J., Tyberghein, L., Bosh, S., Verbruggen, H., Serrão, E. A., & De Clerck, O. (2017). Bio-ORACLE v2.0: Extending marine data layers for bioclimatic modelling. *Global Ecology and Biogeography*.

[access publication] [supporting information]

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**bio-oracle.org**

set of layers for marine environmental parameters

dissox	templtmax_bdmin
sstmean	templtmin_bdmax
sstrange	templtmin_bdmean
bathymean	templtmin_bdmin
curvelltmax_bdmax	carbonphytoltmax_bdmax
curvelltmax_bdmean	carbonphytoltmax_bdmean
curvelltmax_bdmin	carbonphytoltmax_bdmin
curvelltmin_bdmax	carbonphytoltmin_bdmax
curvelltmin_bdmean	carbonphytoltmin_bdmean
curvelltmin_bdmin	carbonphytoltmin_bdmin
dissoxltmax_bdmax	templtmax_ss
dissoxltmax_bdmean	templtmin_ss
dissoxltmax_bdmin	tempmean_ss
dissoxltmin_bdmax	temprange_ss
dissoxltmin_bdmean	curvelmax_ss
dissoxltmin_bdmin	curvelmean_ss
templtmax_bdmax	curvelmin_ss
templtmax_bdmean	curvelrange_ss

Of the total 320, we selected 48 variables, that were not strongly correlated with each other

curvelltmax\_ss  
 curvelltmin\_ss  
 dissoxmean\_ss  
 dissoxrange\_ss  
 dissoxltmax\_ss  
 dissoxltmin\_ss  
 carbonphytomax\_ss  
 carbonphytomean\_ss  
 carbonphytomin\_ss  
 carbonphytorange\_ss  
 carbonphytoltmax\_ss  
 carbonphytoltmin\_ss

	Species					
V	anonycha	borealijaponica	borealis	felis	madokai	onyx
templtmin_ss	2.12	37.30	1.11	76.50	15.17	5.40
bathymean	1.45	1.40	53.31	1.20	2.99	11.50
templtmax_ss	2.44	29.20	0.29	0.10	0.00	4.50
sstmean	19.68	0.00	0.17	0.00	0.00	4.70
carbonphytomin_ss	5.42	0.30	0.97	1.20	10.43	6.10
dissoxltmax_ss	4.58	9.40	3.06	0.00	1.84	2.90
templtmin_bdmin	11.35	0.20	0.06	0.00	8.33	0.60
carbonphytoltmin_bdmin	0.42	0.30	0.00	0.10	16.66	2.50
sstrange	5.77	5.10	1.07	0.50	2.38	4.90
dissoxrange_ss	10.88	0.50	2.45	0.00	4.73	0.40
curvelltmin_bdmin	6.22	0.40	8.17	0.40	3.09	0.50
tempmean_ss	0.00	0.00	0.00	14.00	0.63	0.10
dissoxmean_ss	0.04	0.00	0.00	0.40	0.00	11.50
templtmax_bdmax	0.00	2.80	3.86	0.00	3.76	0.00
carbonphytoltmin_ss	3.27	2.50	2.94	0.10	0.93	0.20
carbonphytoltmax_bdmin	1.90	0.00	0.39	0.10	0.74	6.10
templtmax_bdmin	0.08	1.00	0.00	0.00	5.00	2.70
dissoxltmin_bdmax	0.37	0.00	8.10	0.00	0.00	0.20
curvelltmin_bdmean	1.22	0.20	1.73	0.60	2.77	1.60
carbonphytoltmax_bdmean	0.27	0.00	0.06	0.00	0.05	7.40
dissoxltmin_bdmean	0.00	2.40	0.37	0.00	1.79	3.00
curvelltmax_bdmax	3.49	0.30	0.06	0.10	0.32	2.50
dissoxltmin_bdmin	1.48	0.20	2.91	0.50	1.33	0.00
carbonphytomean_ss	0.60	1.00	0.00	0.10	1.50	2.90
carbonphytorange_ss	4.53	0.10	0.00	0.00	0.04	1.20
curvelltmin_ss	0.26	0.70	0.61	0.40	2.79	0.90
templtmin_bdmean	0.63	0.00	0.00	0.00	0.00	4.30
dissoxltmax_bdmax	0.66	0.00	1.87	0.00	0.00	2.40
curvelmax_ss	1.43	0.70	1.19	0.00	0.00	1.00
curvelmin_ss	2.14	0.10	0.00	0.10	0.73	1.10
curvelltmax_bdmin	1.28	0.20	0.00	1.20	0.78	0.70
curvelltmin_bdmax	0.00	0.40	0.83	0.40	0.95	1.30
templtmax_bdmean	0.00	0.10	0.00	0.00	3.47	0.20
temprange_ss	1.36	0.00	0.00	1.10	1.05	0.00
dissox	0.23	0.20	2.75	0.00	0.00	0.10
curvelmean_ss	0.00	0.80	0.00	0.30	1.89	0.20
carbonphytoltmax_ss	0.76	0.00	0.00	0.00	0.51	1.50
templtmin_bdmax	0.83	0.00	0.00	0.00	0.58	0.80
carbonphytomax_ss	0.22	0.10	0.00	0.40	1.25	0.20

**Machine learning was based on squid occurrence and absence (no catch) in a trawl haul (training sample included 80% of observations, and test sample 20%)**

Judging from the values of permutations (PI):

- 1) for Gonatid squid, SST values were less important, and Carbon values expressed via phytoplankton were more important
- 2) for *A. felis* and *O. borealijaponica* SST values were more important than other analyzed factors

Then we dropped (removed) variables until all of them had permutation importance (PI) greater than 0.5% for each species

AUC (Area Under Curve value) didn't change much, but the number of variables decreased to

*O. anonycha* – 17

*O. borealijaponica* – 23

*B. borealis* – 18

*A. felis* – 18

*G. madokai* – 24

*G. onyx* – 30

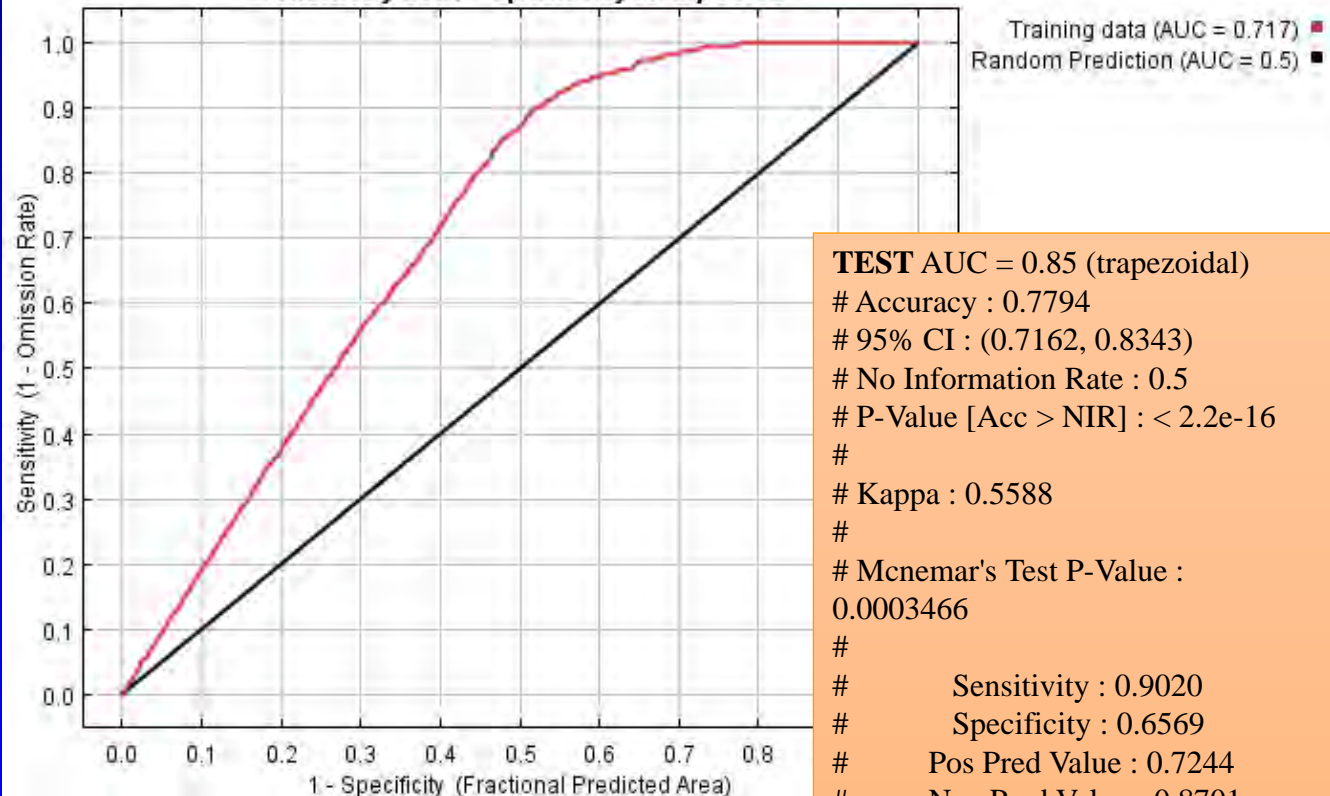
All sets of selected variables were different for each species

Finally, we estimated PI and contribution of a variable (VI) in a full set for those variables which had PI > 0.5% during training

Species	anonycha	
V	VI	PI
carbonphytolmax_bdmin	46.8	0.5
templtmin_ss	19.4	2
dissoxltmax_ss	9.0	6.3
templtmin_bdmin	7.0	14.4
carbonphytorange_ss	3.0	3.8
carbonphytolmax_ss	2.2	8
carbonphytomin_ss	1.8	1.5
curvelltmin_bdmin	1.6	4.4
curvelmax_ss	1.3	5.1
sstmean	1.2	14.9
templtmax_ss	1.1	3.7
carbonphytolmin_ss	1.1	6.4
dissoxrange_ss	0.9	0.3
curvelltmax_bdmin	0.7	0
carbonphytolmax_bdmax	0.6	6.1
sstrange	0.5	0.3
bathymean	0.4	15.8
dissoxltmin_bdmin	0.3	1.7
templtmin_bdmean	0.2	1.8
curvelrange_ss	0.2	0.4
carbonphytomean_ss	0.2	0.7
curvelltmax_bdmax	0.1	0.4
curvelltmin_bdmean	0.1	0.2
temprange_ss	0.1	0.5
curvelmin_ss	0.1	0.6
templtmin_bdmax	0.0	0
dissoxltmax_bdmax	0.0	0

## *Okutania anonycha*

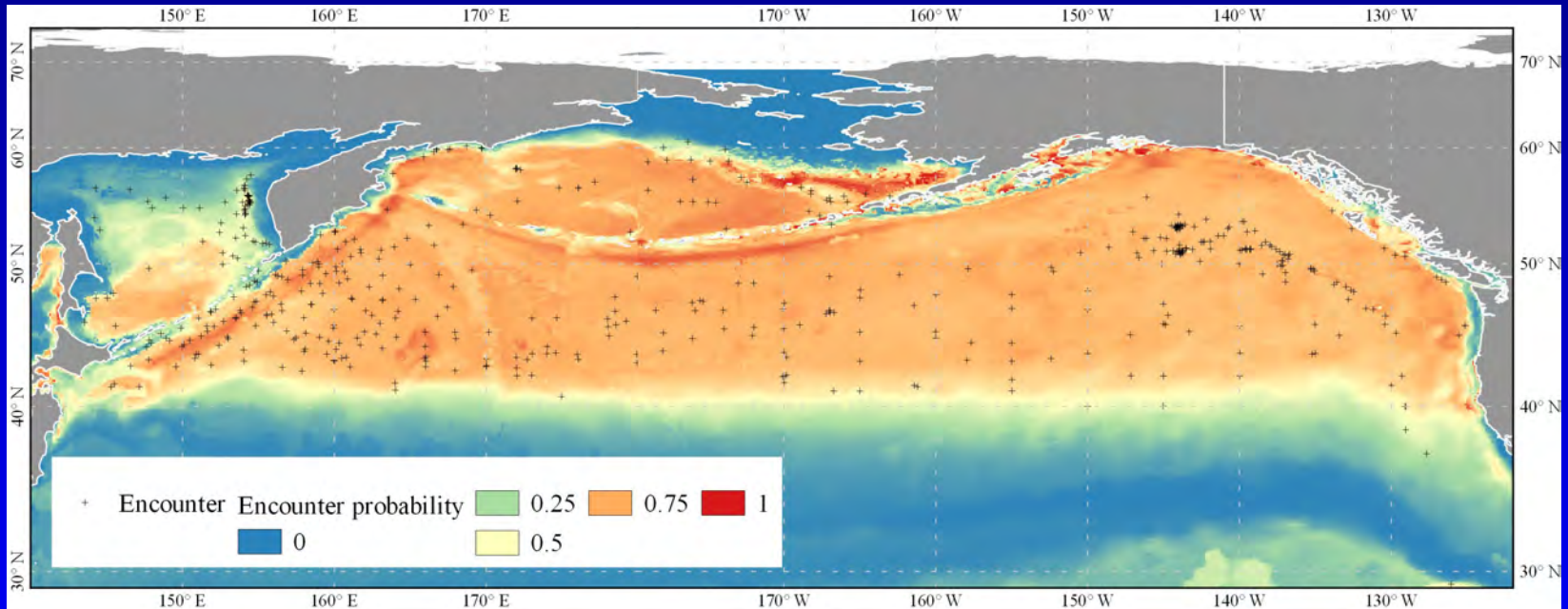
Sensitivity vs. 1 - Specificity for species



**TEST AUC = 0.85 (trapezoidal)**  
 # Accuracy : 0.7794  
 # 95% CI : (0.7162, 0.8343)  
 # No Information Rate : 0.5  
 # P-Value [Acc > NIR] : < 2.2e-16  
 #  
 # Kappa : 0.5588  
 #  
 # McNemar's Test P-Value : 0.0003466  
 #  
 # Sensitivity : 0.9020  
 # Specificity : 0.6569  
 # Pos Pred Value : 0.7244  
 # Neg Pred Value : 0.8701  
 # Prevalence : 0.5000  
 # Detection Rate : 0.4510  
 # Detection Prevalence : 0.6225  
 # Balanced Accuracy : 0.7794

# *Okutania anonycha*

Occurrence and Encounter Probability based on abiotic and biotic factors from Bio-Oracle

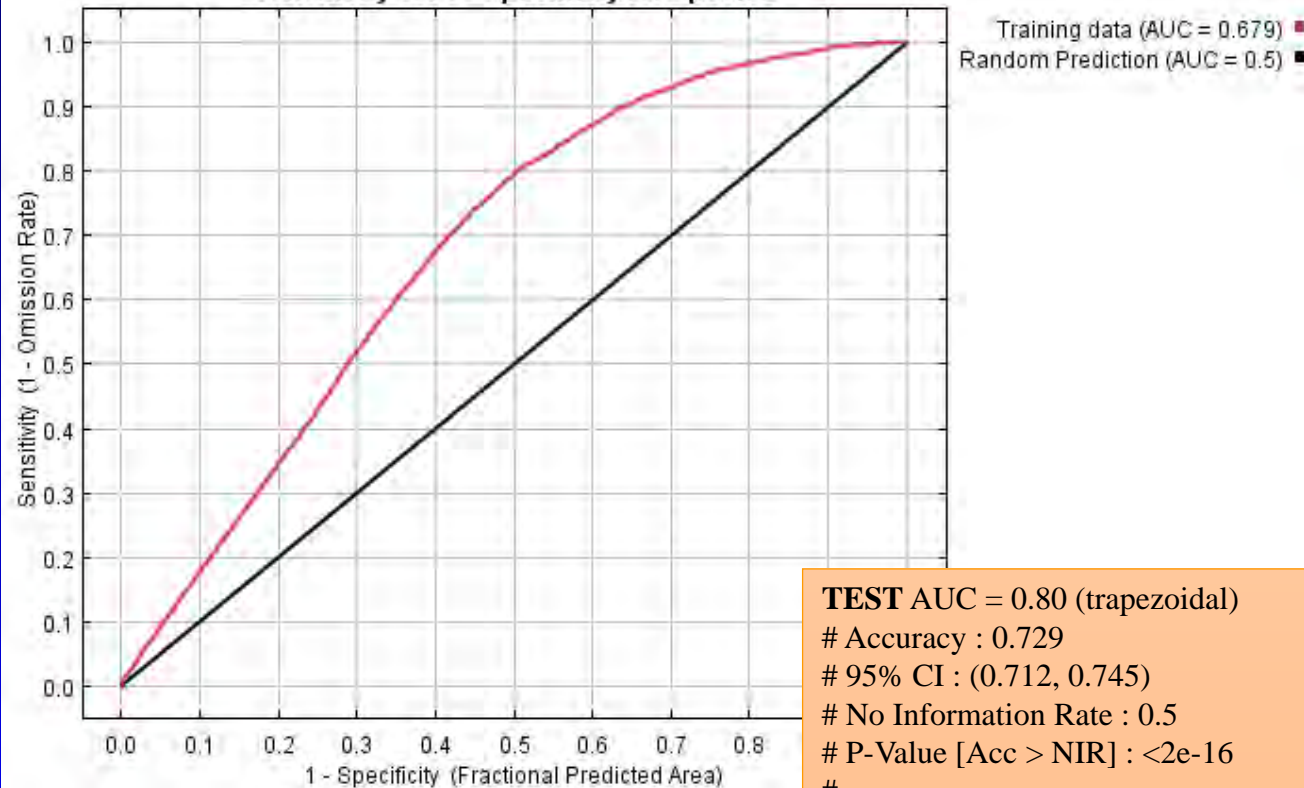


- 1) relatively even encounter probability in the NPO
- 2) increased probability along the island chains

# Boreoteuthis borealis

Species	borealis		
V	VI	PI	
carbonphytolmax_bdmean	39.6	2.9	
templtmin_ss	14.9	1.6	
dissoxlmax_bdmax	13.1	5.6	
templtmax_bdmax	6.4	7.7	
dissox	5.8	1.7	
curvelltmin_bdmin	4.4	6.8	
bathymean	4.3	64.2	
dissoxltmin_bdmin	1.8	0.1	
curvelltmax_ss	1.7	2.7	
carbonphytolmin_ss	1.6	0.6	
curvelltmin_bdmean	1.6	0.4	
dissoxlmax_ss	1.0	1.2	
dissoxltmin_bdmean	0.9	0.5	
sstrange	0.8	2.2	
dissoxltmin_bdmax	0.8	1.1	
curvelmax_ss	0.7	0.1	
carbonphytomin_ss	0.4	0.5	
dissoxrange_ss	0.3	0.2	

Sensitivity vs. 1 - Specificity for species



TEST AUC = 0.80 (trapezoidal)

# Accuracy : 0.729

# 95% CI : (0.712, 0.745)

# No Information Rate : 0.5

# P-Value [Acc > NIR] : <2e-16

#

# Kappa : 0.458

#

# McNemar's Test P-Value : 0.229

#

# Sensitivity : 0.741

# Specificity : 0.717

# Pos Pred Value : 0.723

# Neg Pred Value : 0.735

# Prevalence : 0.500

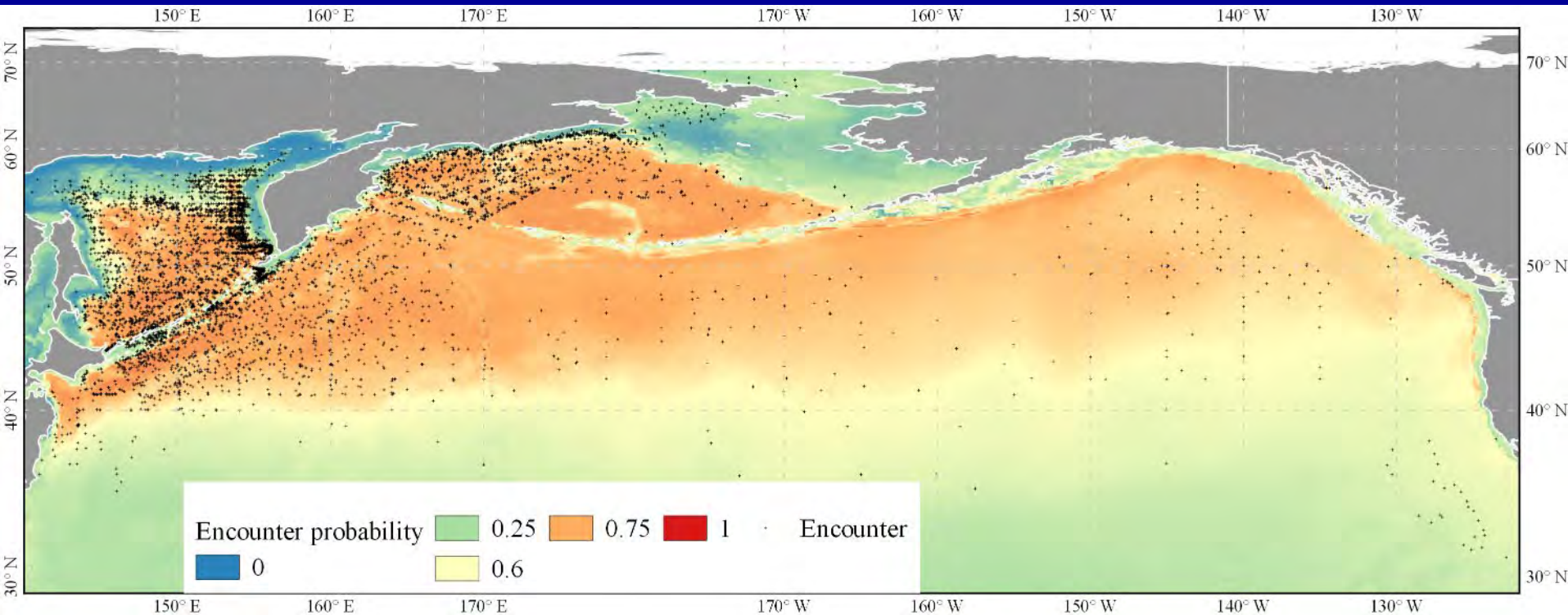
# Detection Rate : 0.371

# Detection Prevalence : 0.512

# Balanced Accuracy : 0.729

# *Boreoteuthis borealis*

Occurrence and Encounter Probability based on abiotic and biotic factors from Bio-Oracle



1) higher probability in the NWPO compared to NEPO

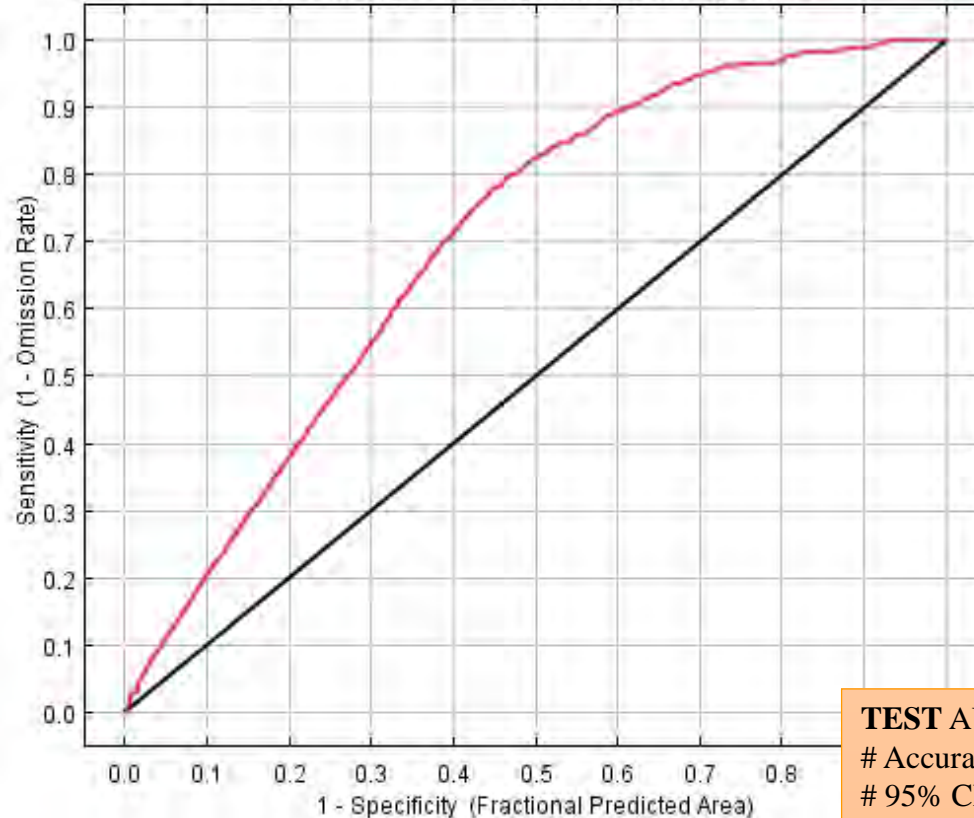
2) high probability in the Okhotsk Sea



# Gonatus onyx

Species	onyx	
V	VI	PI
carbonphytolmax_bdmean	56.3	4.4
bathymean	10.8	50.1
carbonphytolmin_bdmin	10.8	0
templtmin_ss	7.2	2.9
carbonphytolmax_bdmax	3.2	0
carbonphytomean_ss	2.0	2.5
templtmax_bdmin	1.7	1.2
sstmean	1.6	12.8
carbonphytorange_ss	0.9	4.2
curvelltmin_bdmean	0.8	0.9
templtmax_ss	0.8	0.1
templtmin_bdmax	0.7	4
sstrange	0.7	0
dissoxltmax_ss	0.6	0.2
curvelltmin_bdmin	0.3	4.7
dissoxmean_ss	0.3	5.3
dissoxltmin_bdmean	0.3	1.2
dissoxltmax_bdmin	0.2	0.7
dissoxltmax_bdmax	0.2	0
curvelltmax_ss	0.1	1.1
carbonphytomin_ss	0.1	0.3
curvelrange_ss	0.1	0.2
carbonphytolmax_ss	0.1	0.6
curvelmin_ss	0.1	0.7
curvelltmax_bdmax	0.0	0.4
tempmean_ss	0.0	0
templtmin_bdmean	0.0	0.1
curvelmax_ss	0.0	0
curvelltmin_bdmax	0.0	1.4
curvelltmax_bdmin	0.0	0

Sensitivity vs. 1 - Specificity for species

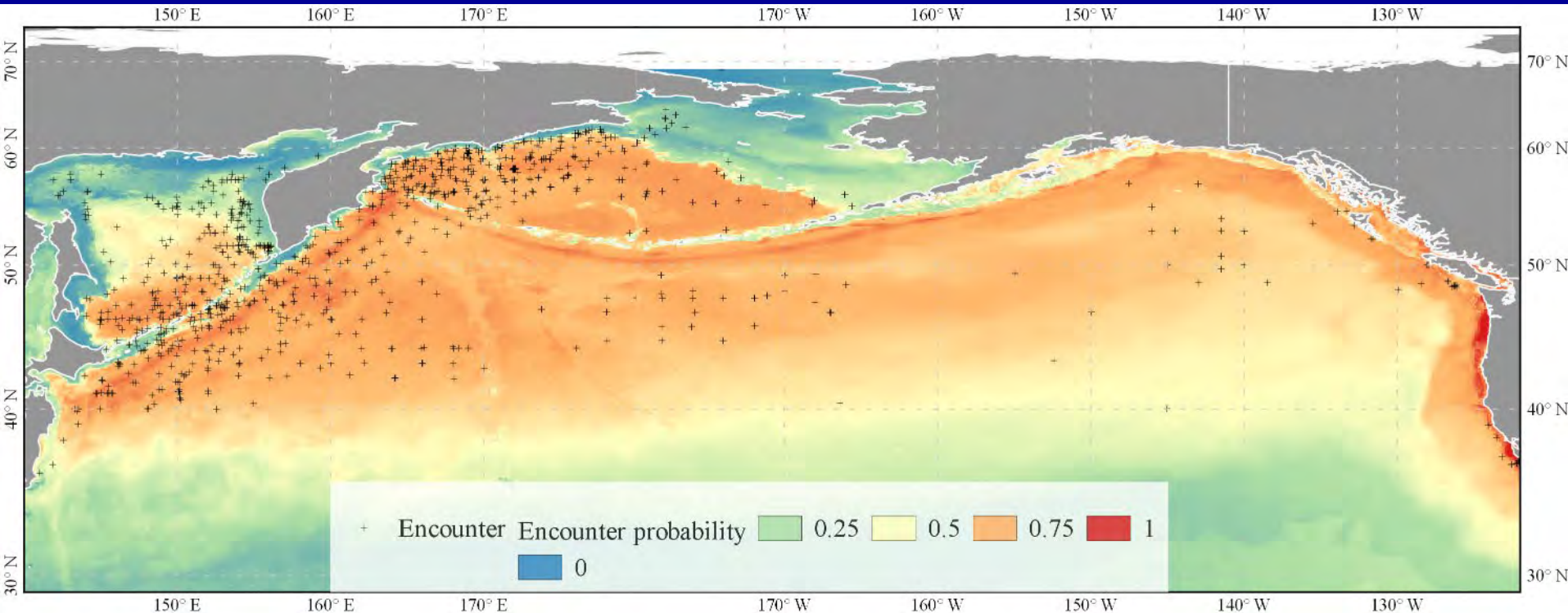


Training data (AUC = 0.699) ■  
Random Prediction (AUC = 0.5) ■

**TEST AUC = 0.81 (trapezoidal)**  
 # Accuracy : 0.763  
 # 95% CI : (0.717, 0.805)  
 # No Information Rate : 0.5  
 # P-Value [Acc > NIR] : <2e-16  
 #  
 # Kappa : 0.526  
 #  
 # McNemar's Test P-Value : 0.834  
 #  
 # Sensitivity : 0.771  
 # Specificity : 0.755  
 # Pos Pred Value : 0.759  
 # Neg Pred Value : 0.767  
 # Prevalence : 0.500  
 # Detection Rate : 0.385  
 # Detection Prevalence : 0.508  
 # Balanced Accuracy : 0.763

# *Gonatus onyx*

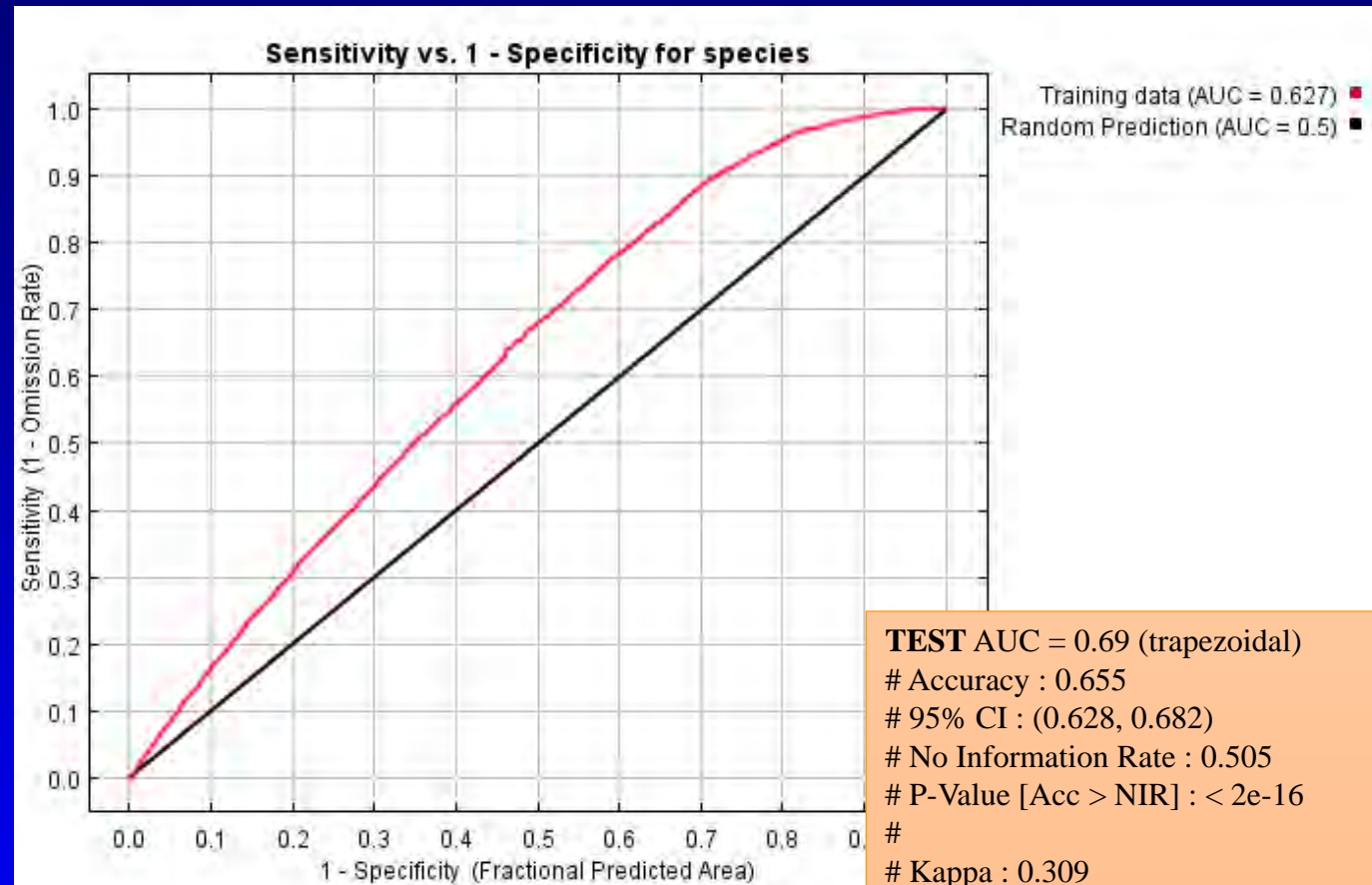
Occurrence and Encounter Probability based on abiotic and biotic factors from Bio-Oracle



- 1) higher probability in the NWPO compared to NEPO
- 2) increased probability of occurrence along the trenches

# Gonatus madokai

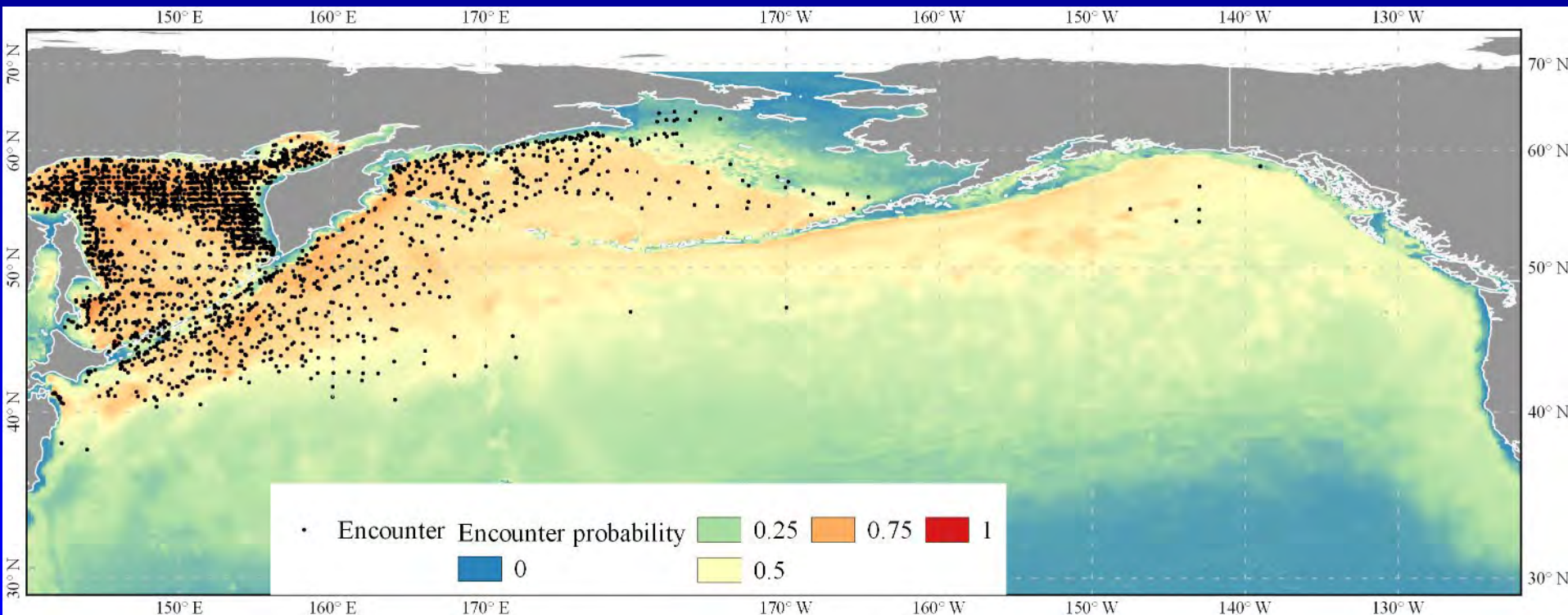
V	VI	PI
carbonphytolmin_bdmin	42.90	7.69
carbonphytomin_ss	19.00	6.63
templtmin_ss	14.10	25.30
curvelltmin_bdmin	4.48	1.31
carbonphytolmin_ss	2.69	6.16
curvelmin_ss	2.35	2.27
carbonphytolmin_bdmax	2.12	2.24
curvelltmin_bdmean	1.99	0.73
carbonphytolmax_bdmin	1.91	0.17
curvelltmax_bdmin	1.58	3.08
dissoxlmin_bdmean	1.54	0.32
templtmin_bdmin	1.51	7.14
curvelltmin_ss	0.77	2.73
templtmax_bdmin	0.67	1.84
carbonphytomean_ss	0.58	3.05
dissoxrange_ss	0.54	3.57
carbonphytomax_ss	0.30	3.43
templtmax_bdmean	0.26	8.06
bathymean	0.24	5.05
templtmin_bdmax	0.15	5.32
sstrange	0.14	2.33
templtmax_bdmax	0.08	1.04
curvelltmin_bdmax	0.07	0.35
tempmean_ss	0.07	0.20



**TEST AUC = 0.69 (trapezoidal)**  
 # Accuracy : 0.655  
 # 95% CI : (0.628, 0.682)  
 # No Information Rate : 0.505  
 # P-Value [Acc > NIR] : < 2e-16  
 #  
 # Kappa : 0.309  
 #  
 # McNemar's Test P-Value : 1.2e-07  
 #  
 # Sensitivity : 0.747  
 # Specificity : 0.562  
 # Pos Pred Value : 0.635  
 # Neg Pred Value : 0.685  
 # Prevalence : 0.505  
 # Detection Rate : 0.377  
 # Detection Prevalence : 0.594  
 # Balanced Accuracy : 0.654

# *Gonatus madokai*

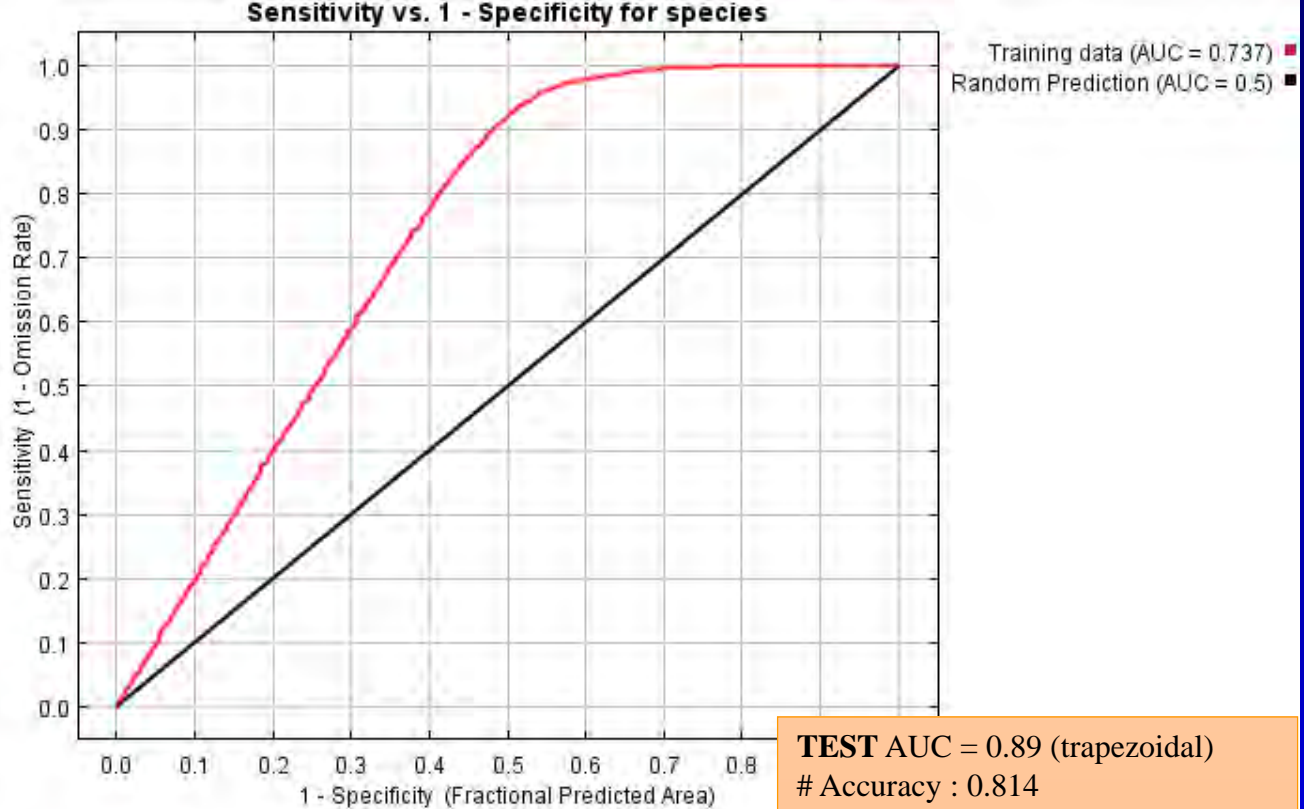
Occurrence and Encounter Probability based on abiotic and biotic factors from Bio-Oracle



- 1) notably higher probability in the NWPO compared to NEPO
- 2) increased probability of occurrence in the Okhotsk Sea

# *Onychoteuthis borealijaponica*

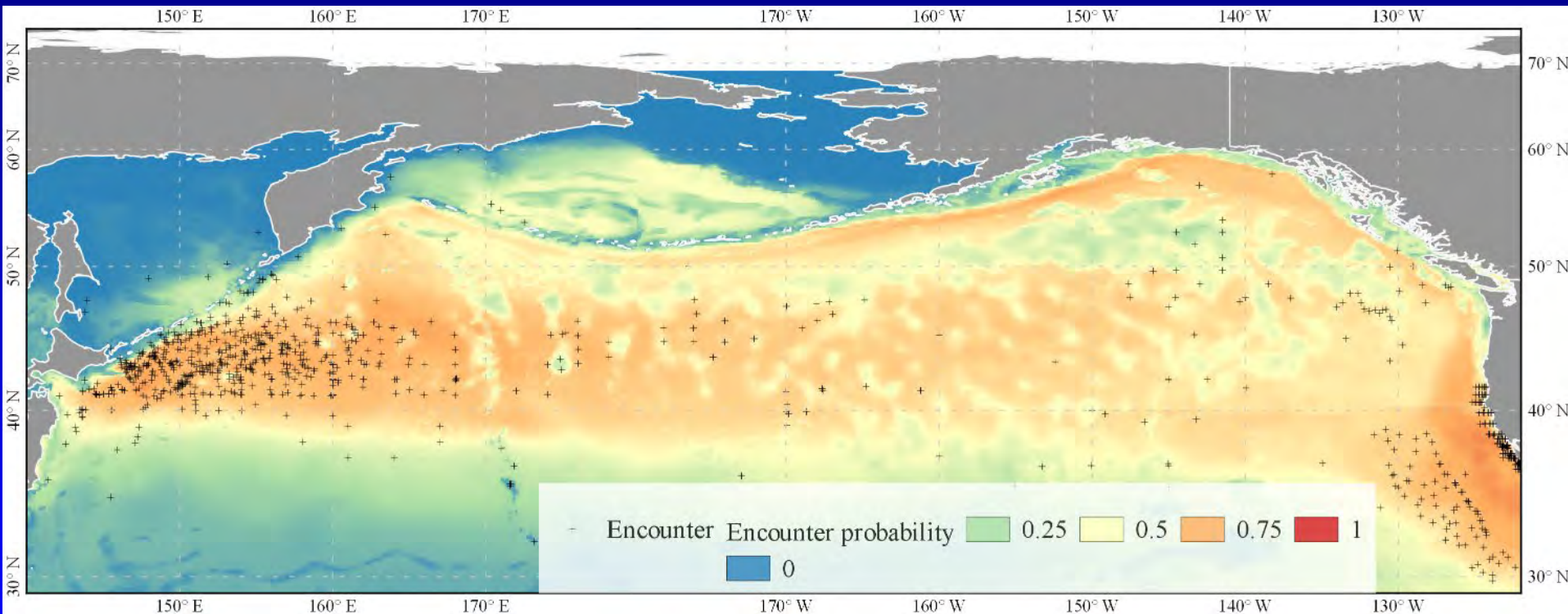
Species	borealijaponica	
V	VI	PI
templtmin_ss	73.2	50
templtmax_ss	10.4	6.4
bathymean	2.1	16.6
sstrange	2.1	1.6
curvelltmin_ss	1.7	2.3
carbonphytolmin_ss	1.4	1.7
curvelmean_ss	1.4	1.4
dissoxrange_ss	1.3	1.4
curvelltmin_bdmean	1.1	0.4
curvelltmin_bdmax	0.9	0.1
carbonphytomax_ss	0.8	0.3
dissoxltmin_bdmean	0.8	3.6
curvelltmin_bdmin	0.7	0
dissoxltmax_ss	0.4	1.6
templtmax_bdmax	0.4	3.3
dissox	0.4	1.1
templtmax_bdmin	0.3	2.5
carbonphytomean_ss	0.3	4.8
carbonphytorange_ss	0.3	0
curvelltmax_bdmin	0.2	0
curvelmax_ss	0.1	1
dissoxltmin_ss	0.0	0
curvelrange_ss	0.0	0



**TEST AUC = 0.89 (trapezoidal)**  
 # Accuracy : 0.814  
 # 95% CI : (0.778, 0.847)  
 # No Information Rate : 0.5  
 # P-Value [Acc > NIR] : < 2e-16  
 #  
 # Kappa : 0.628  
 #  
 # McNemar's Test P-Value : 4.59e-08  
 #  
 # Sensitivity : 0.921  
 # Specificity : 0.708  
 # Pos Pred Value : 0.759  
 # Neg Pred Value : 0.899  
 # Prevalence : 0.500  
 # Detection Rate : 0.460  
 # Detection Prevalence : 0.607  
 # Balanced Accuracy : 0.814

# *Onychoteuthis borealijaponica*

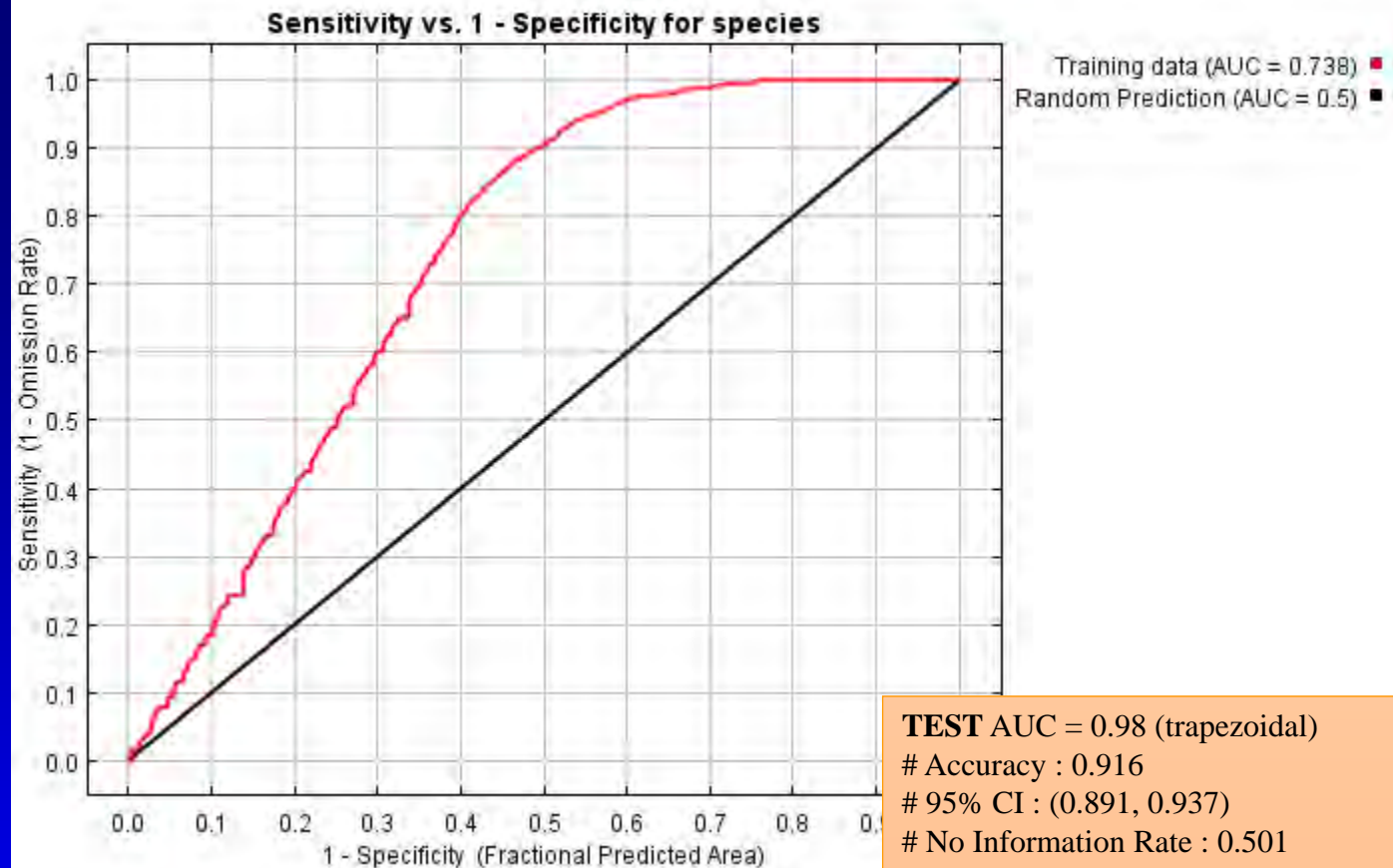
Occurrence and Encounter Probability based on abiotic and biotic factors from Bio-Oracle



- 1) almost 0 probability of occurrence in the upper boreal regions
- 2) patchy distribution in offshore areas

# Abraliopsis felis

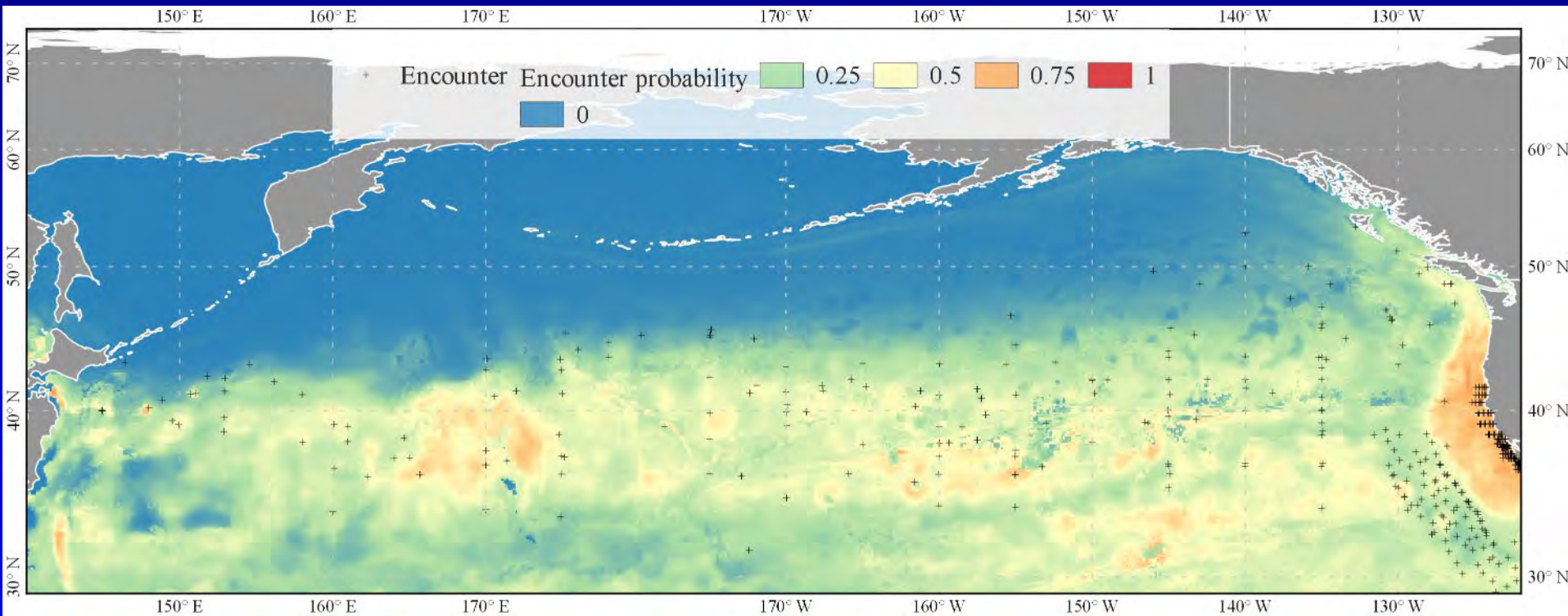
Species	felis	
V	VI	PI
templtmin_ss	29.4	51.6
carbonphytomax_ss	28.4	7.3
dissoxmean_ss	8.7	0
curvelltmax_bdmin	6.3	13.3
carbonphytolttmin_ss	5.1	8.1
curvelmean_ss	3.7	0.5
tempmean_ss	3.3	12.5
temprange_ss	2.8	0.8
sstrange	2.7	0.8
carbonphytomin_ss	2.5	2
carbonphytomean_ss	2.3	0
curvelltmin_ss	2.1	0.6
curvelmin_ss	1.4	0.4
curvelltmin_bdmax	0.6	0.6
curvelltmin_bdmin	0.4	0.7
bathymean	0.2	0.3
templtmax_ss	0.1	0.1
curvelltmax_ss	0.1	0.4



**TEST AUC = 0.98 (trapezoidal)**  
 # Accuracy : 0.916  
 # 95% CI : (0.891, 0.937)  
 # No Information Rate : 0.501  
 # P-Value [Acc > NIR] : <2e-16  
 #  
 # Kappa : 0.831  
 #  
 # McNemar's Test P-Value : 0.401  
 #  
 # Sensitivity : 0.904  
 # Specificity : 0.927  
 # Pos Pred Value : 0.925  
 # Neg Pred Value : 0.906  
 # Prevalence : 0.499  
 # Detection Rate : 0.451  
 # Detection Prevalence : 0.488  
 # Balanced Accuracy : 0.916

# *Abraliopsis felis*

Occurrence and Encounter Probability based on abiotic and biotic factors from Bio-Oracle



1) higher probability of occurrence in the subtropical belt

2) patchy (uneven) pattern



# General observations on potential distribution patterns in the NPO for pelagic squid that have been encountered in the GoA 2019 spring survey

- specific habitat suitability patterns were constructed using MaxEnt for pelagic squid based on known species long-term occurrence in the NPO (TINRO database and GBIF) and Bio-Oracle layers
- from 17 to 30 abiotic and biotic variables per species were selected using PI (permutation importance) and VC (variable contribution) to produce statistically robust (with AUC>0.65) distribution profiles for 6 species of pelagic squid
- the constructed potential distribution maps suggested that 4 species of the family Gonatidae (*Okutania anonycha*, *Boreoteuthis borealis*, *Gonatus onyx* and *G.madokai*) were associated basically with high latitude boreal (cold water) areas in the NPO, whereas the Enoploteuthid species (*Abraliopsis felis*) was associated mainly with lower latitude subtropical areas, and the Onychoteuthid species (*Onychoteuthis borealijaponica*) showed wide occurrence from subtropical through transitional and up to boreal waters
- specific spatial distribution differences were revealed for the Gonatid squid:
  - (1) *Okutania anonycha*, *Boreoteuthis borealis* and *Gonatus onyx* showed up as wide-boreal trans-pacific species, whereas *Gonatus madokai* showed clear tendency to be distributed mainly in the northwestern NPO
  - (2) *Okutania anonycha* habitat appeared as mainly broadly oceanic offshore, whereas that of *Boreoteuthis borealis* more associated with higher latitude areas, and *Gonatus onyx* tended to be related to deep-sea trenches

# How does the information collected in the GoA 2019 cruise reflect the known (database) and revealed (modeled) patterns of distribution of pelagic squid?
















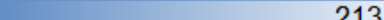











- 5 out of 6 species that have been encountered in the GoA 2019 cruise well fit into the known and modeled distribution patterns:
  - *Boreoteuthis borealis* and *Onychoteuthis borealijaponica* appeared as common species in the research area, GoA observations on those species well fit their known and potential distribution patterns;
  - *Gonatus onyx* and *G. madokai* were much less frequently occurring than the first two, which was less expected for *G.onyx*, than for *G.madokai*;
  - *Abraliopsis felis* were observed mainly to the south-west of the research area, which was also in line with the species distribution patterns
- **ONE** species, the smallfin gonate squid *Okutania anonycha* (= *Berryteuthis anonychus*), which was supposed to be highly abundant in the research area, occurred only in fish stomachs in the GoA 2019 spring survey **!!! Several reasons for that can be considered...**

Possible reasons for the absence of *Okutania anonycha* in the upper-epipelagic trawl catches in GoA in 2019 early spring survey

- False negative occurrence due to **wrong season** for research
- False negative occurrence due to **wrong water layer** studied (too shallow)



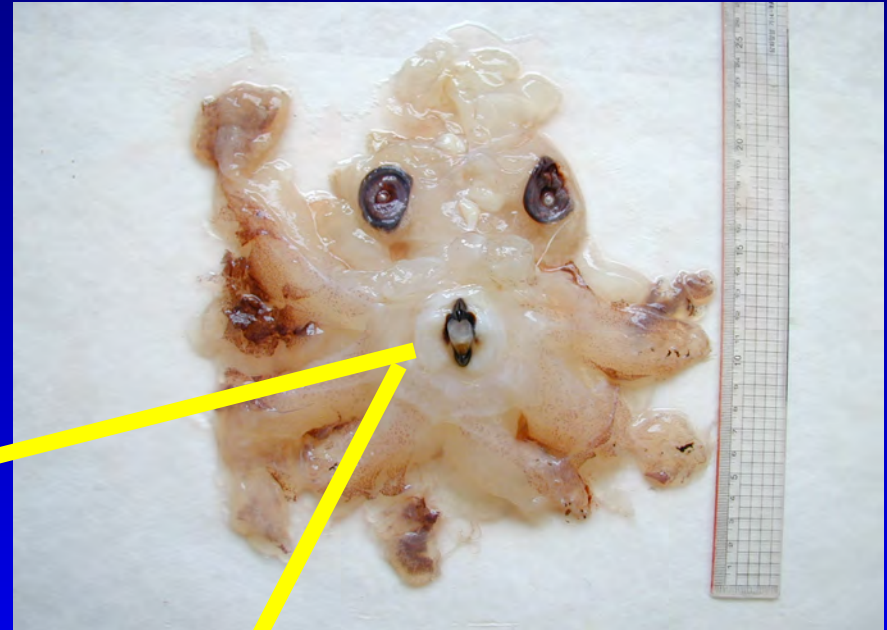
# Depth

<b>n &gt; 0</b>			
Depth of trawl	n/h	kg/h	n stations
000-050		829	 217
051-100		2682	 31
101-200		468	 27
201-300		30	 16
301-400		58	 22
401-500		454	 15
501-600		400	1
601-700		2	1
701-800		15	 7
			<b>337</b>
<b>n &gt; 0 AND kg &gt; 0</b>			
Depth of trawl	n/h	kg/h	n stations
000-050		843	 213
051-100		2865	 29
101-200		524	 24
201-300		29	 15
301-400		58	 22
401-500		518	 13
501-600		400	1
601-700		2	1
			<b>318</b>

- uneven depth occurrence
- maximum density at 50-100 m
- second peak at 400-600 m

# Cephalopods

- Love them
- Catch them
- Eat them
- Study them – they are key components in pelagic marine ecosystems!!!



**Thank you!**