

# Dynamic Target Choice Model in Multi-fisheries

Christopher M Anderson, Keita Abe  
University of Washington

NAAFE Forum 2017  
La Paz, Mexico

# This study

- Estimates harvester's in-season decision of which fishery to target under ITQ management with limiting bycatch.
- Key Idea:
  - Choice of target within a season must make a dynamic plan for using quota, in addition to current factors.
  - Develop reduced-form variable that captures in-season dynamics of quota use.
- Key Result
  - Including the dynamic quota use variable in the RUM improves the fit of the model.
  - Policy counterfactual with the parameter estimates shows the reduction in bycatch with maintained main target.

# Theory on ITQ management

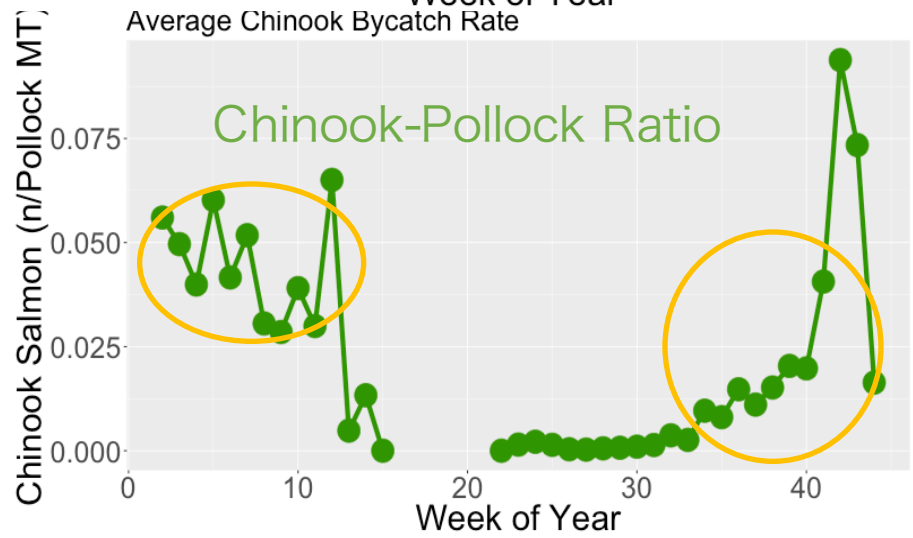
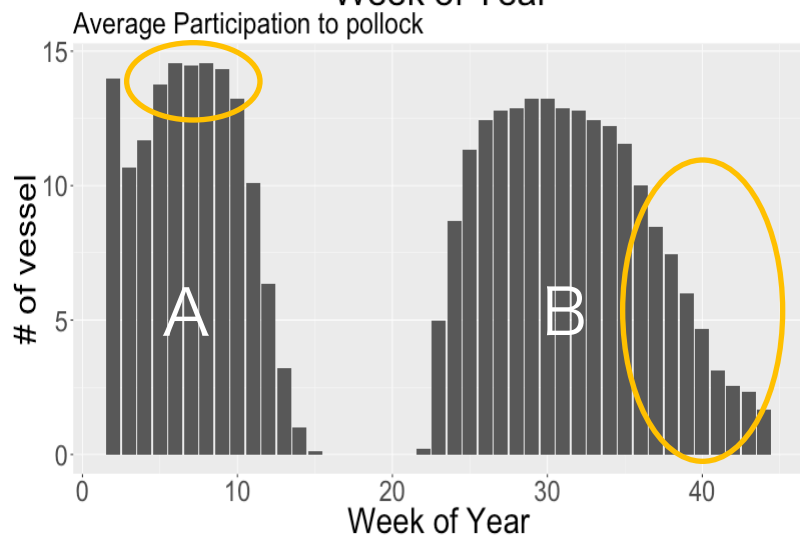
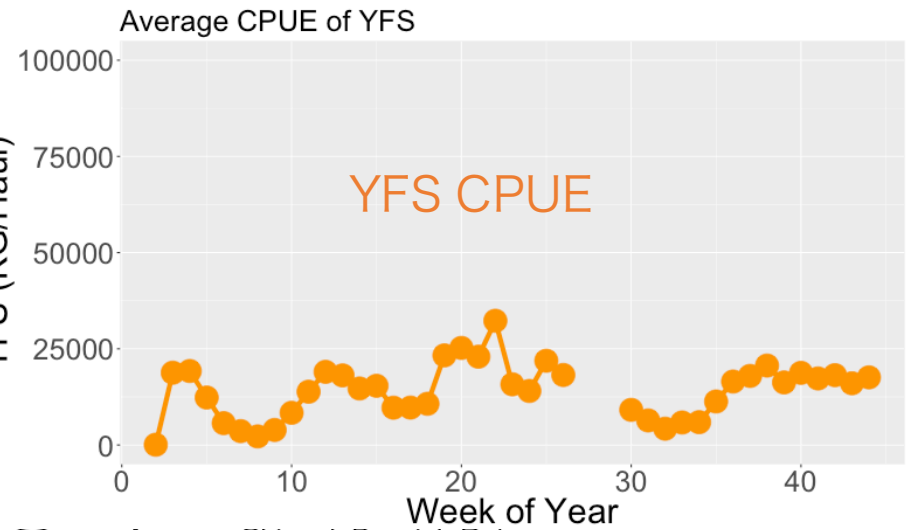
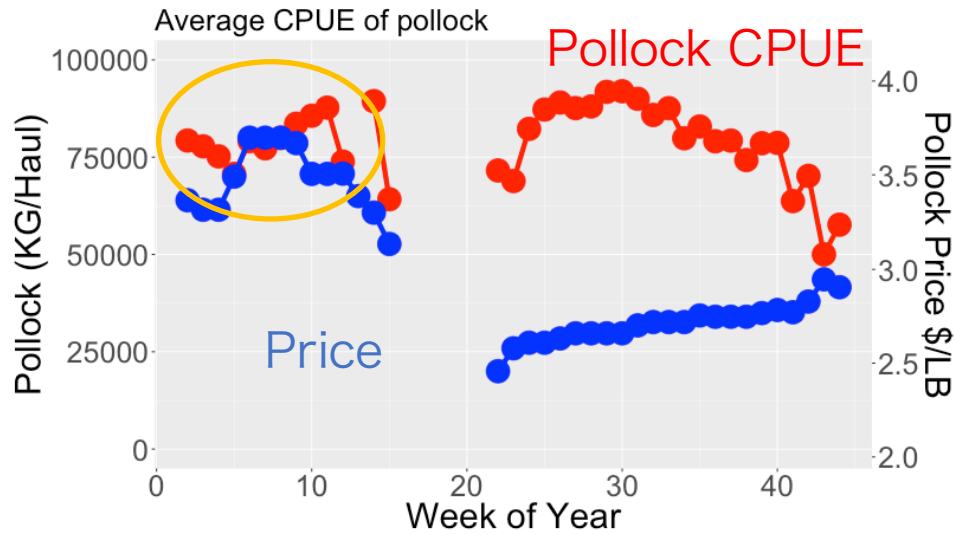
- Single Species Framework
  - ITQ corrects common property problem under bycatch and no production externalities. (Boyce 1992, 1996)
    - Harvesters take into account shadow costs of quota.
- Multi-fishery participation
  - The opportunity cost of fishing is affected by availability of other fisheries.
  - The effect of management in one fishery may affect the timing of participation in another
    - Individual quota allows delay of participation

# Empirical Approach: Harvester Behavior under ITQ

	Single target species	Multi-fishery
Myopic	An advantage of Individual quota is to flexibly allocate the harvest over a season.	The choice problem must consider biological/economic condition of other fisheries available for harvesters.
Dynamic	The choice problem (entry decision) must consider quota allocation over a season.	<u>This Study</u> <ul style="list-style-type: none"> <li>• Harvester choice: Multiple target fisheries</li> <li>• Consider the dynamic quota use within a season.</li> </ul>

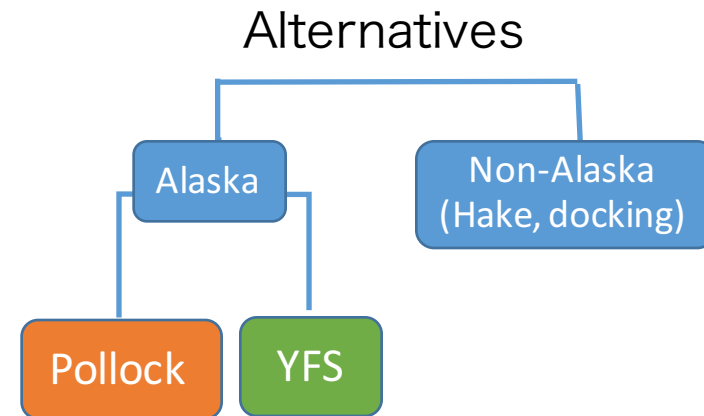
# Application to a fishing fleet

- Offshore fleet (Catcher-Processor)
  - Listed in American Fisheries Act
  - Weekly data
- Main targets
  - Pollock: ITQ management
    - 2 seasons : A (Jan-Jun) & B (Jun-Oct), High value from roe in A season
  - Yellowfin Sole (YFS): TAC
    - No more than “traditional catch” level.
  - Pacific Hake: IQ management, in West coast
    - No Individual data for this, but just numbers of vessels in this fishery.
- Prohibited Species Catch (bycatch)
  - Salmon (Chinook & Chum)



# Empirical Model

- Random Utility Model
- Weekly choice of fishery
- Model incorporates
  - Choice of other fisheries
  - Dynamic quota use



Covariates: Switching cost, # of vessel in hake

Fixed Effects

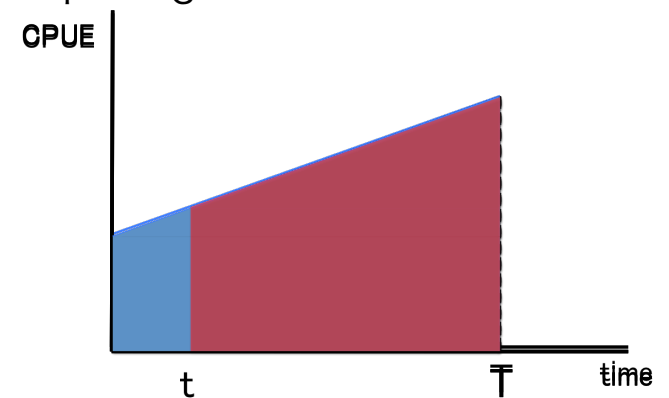
$$U_{ijyw} = \beta_j(X_{iyw})E\left(\frac{Rev}{Haul}\right)_{ijyw} + \gamma(Y_{iyw})E(Bycatch)_{ijyw} + \phi'Z_{ijyw} + \xi_i + \varepsilon_{ijyw}$$

State Variable: Quota Speed, Policy (A91), cumulative catch

# Capturing Dynamic Quota Use

- Reduced form variable: Quota Speed
  - Capture the pace of actual quota use relative to “potential” use
  - Compare the quota left relative to the time left
  - Remaining time is weighted by the expected Revenue PUE
    - If the expected RPUE is high, “more time” to use quota given number of weeks remaining in the season.
  - The value lies between -1 and +1.
    - If it is negative, the usage is too fast.

$$qspeed_{it} = \frac{\%QuotaLeft_{it} - \%WeightTimeLeft_{it}}{\%QuotaLeft_{it} + \%WeightTimeLeft_{it}}$$





# Estimation Result

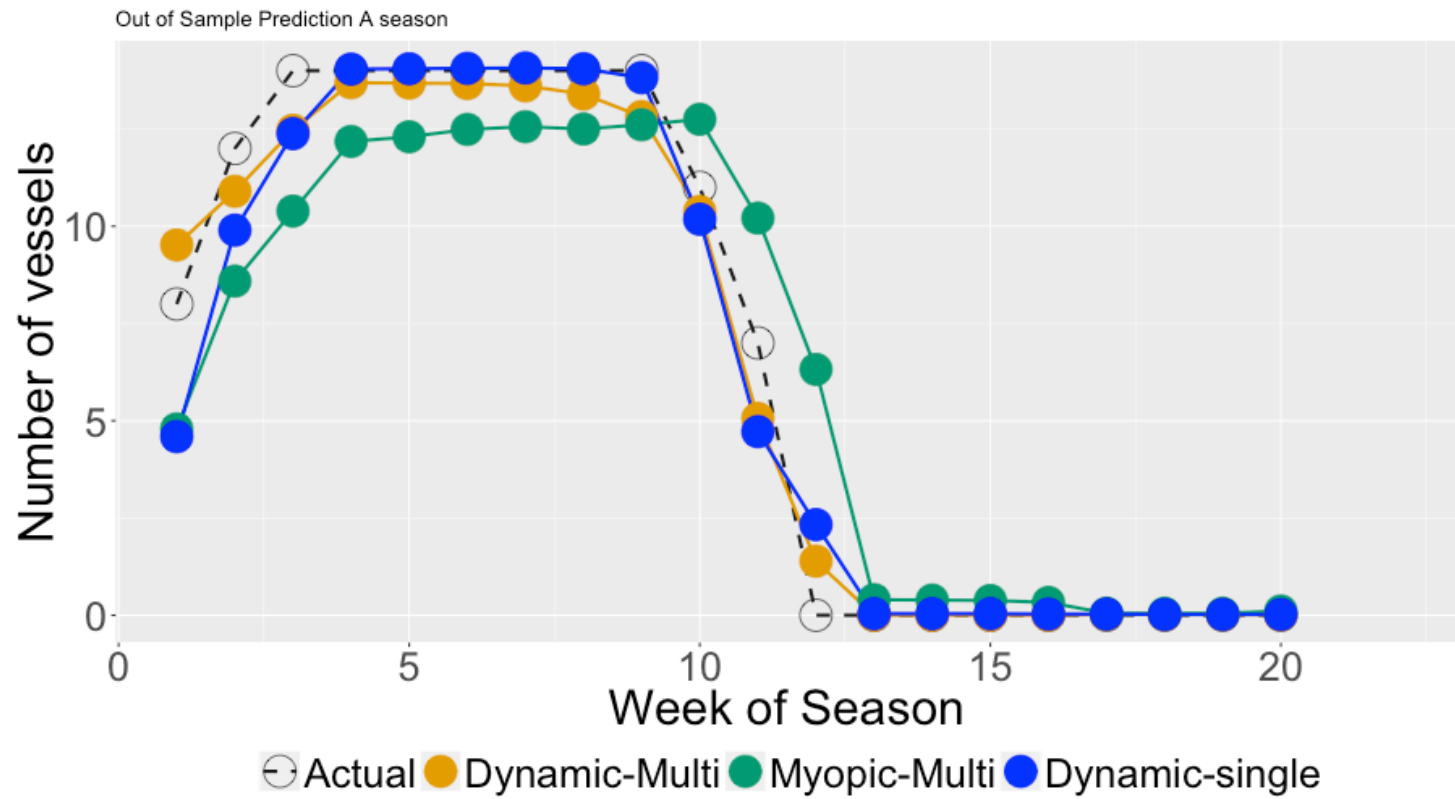
Dependent variable: Target

	A Season			B Season		
	Myopic (1)	Single target (2)	Dyn + Multi (3)	Myopic (4)	Single target (5)	Dyn + Multi (6)
Expected Revenue	0.006*** (0.001)	0.012*** (0.003)	0.025*** (0.002)	-0.012*** (0.003)	-0.006* (0.003)	-0.006 (0.003)
Expected Bycatch Rate	16.445*** (4.821)	7.115 (7.649)	26.660* (10.575)	-69.664*** (9.246)	-51.420** (19.817)	-88.232*** (23.176)
Exp. Rev. x QSpeed		0.041*** (0.004)	0.028*** (0.003)		0.038*** (0.003)	0.023*** (0.002)
Exp. Byc. Rate x QSpeed		45.498** (16.619)	59.712** (22.107)		96.776*** (27.121)	33.467 (30.037)
Akaike Inf. Crit.	1636.36	607.6	958.73	1484.43	858.74	980.98
Observations	2,551	2,551	2,551	2,668	2,668	2,668
Log Likelihood	-795.181	-279.800	-453.367	-719.214	-405.369	-464.489

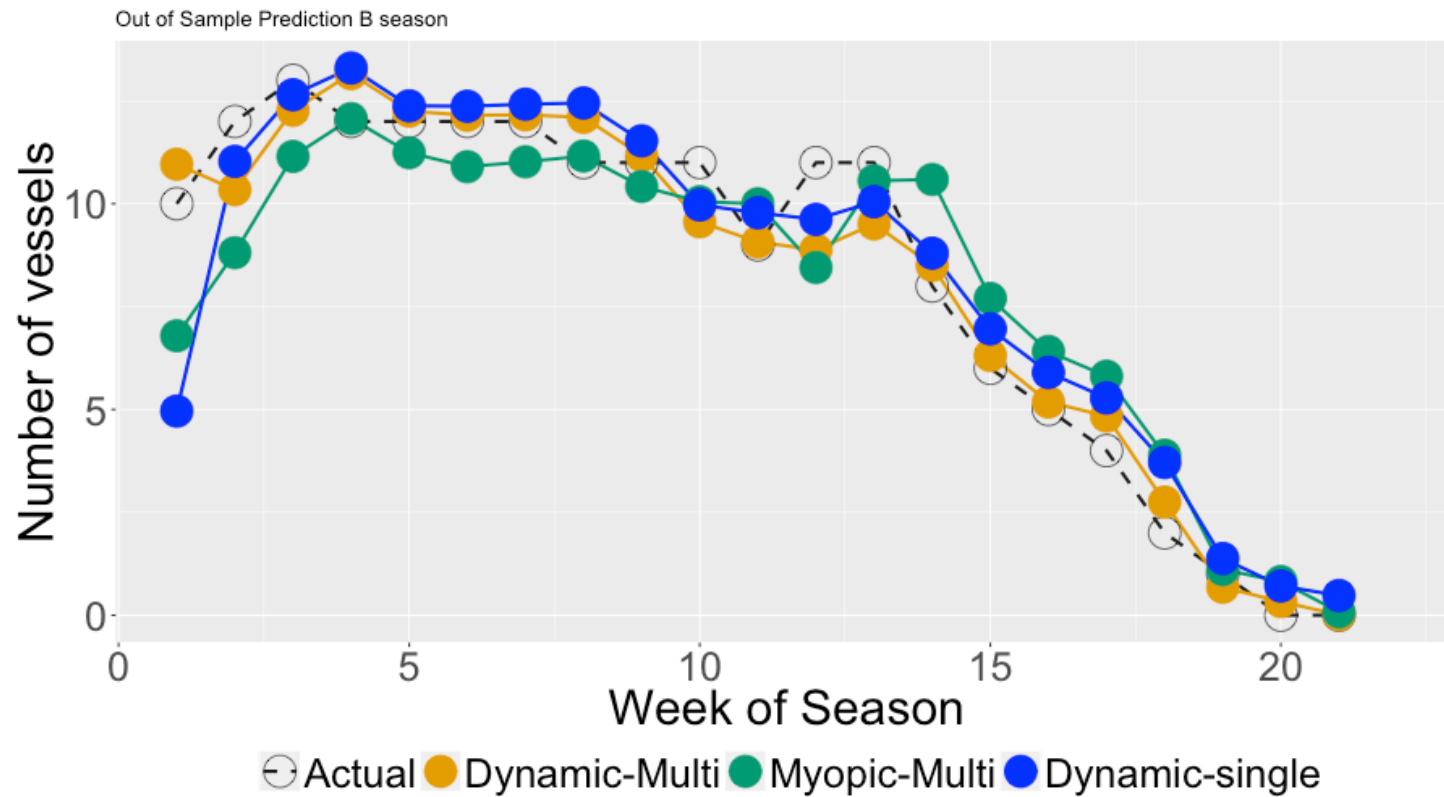
Note: Only Key Variables are shown

\*p<0.05 \*\*p<0.01 \*\*\*p<0.001

# Pollock Participation Prediction (A season)



# Pollock Participation Prediction (B season)

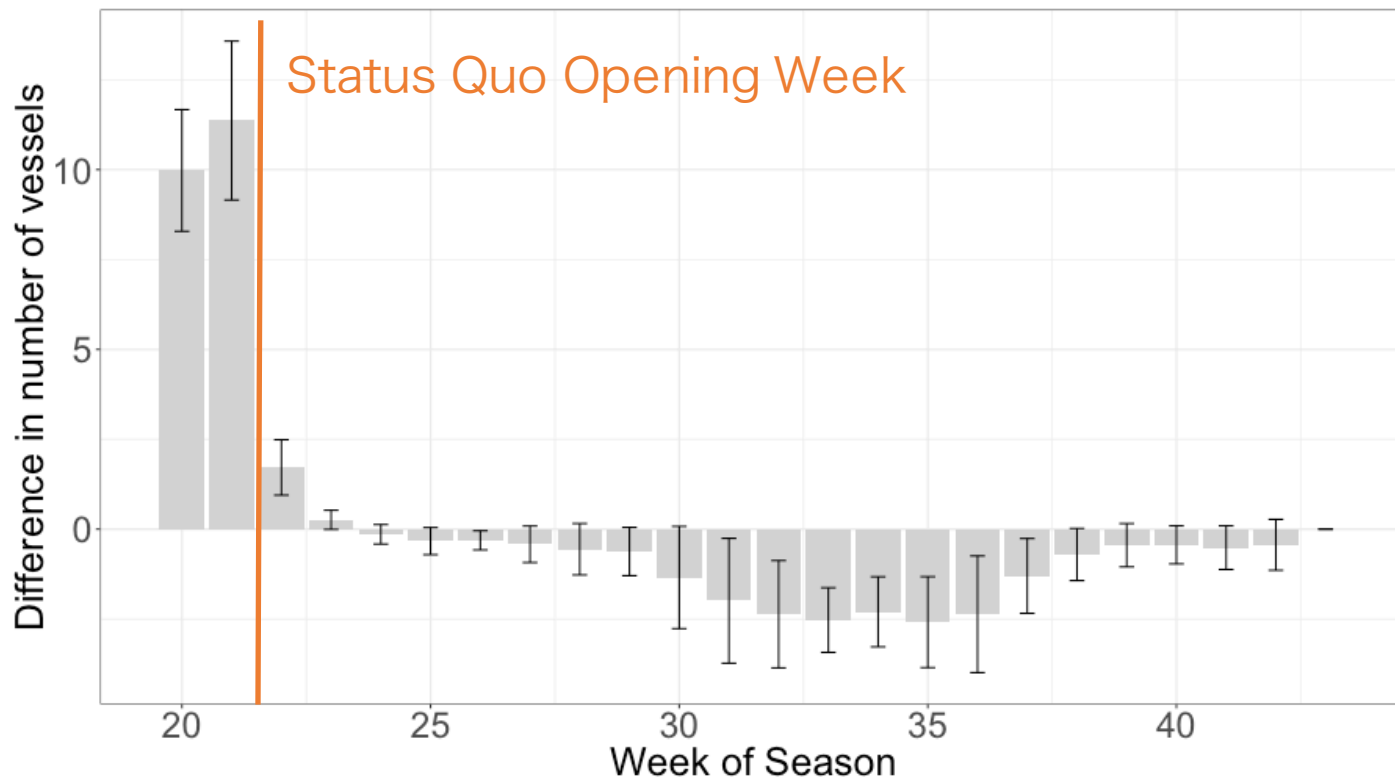


# Use in Policy Evaluation

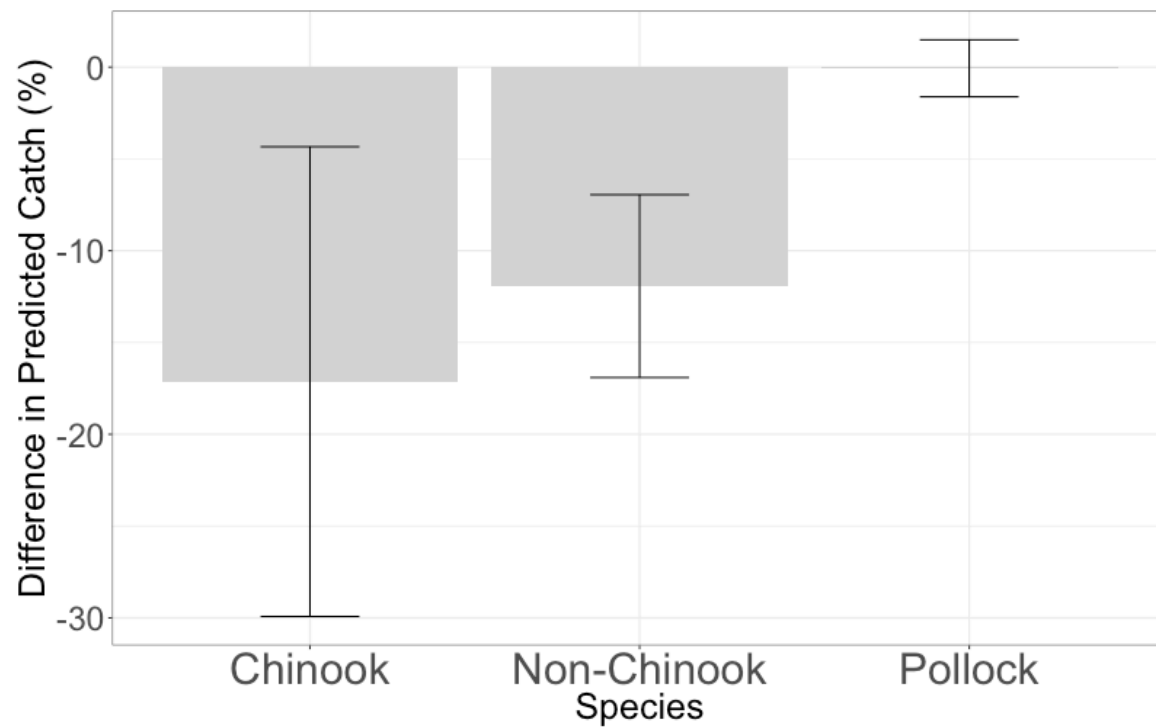
- Setting
  - Proposed Policy: Open B season 2 weeks earlier than status quo.
  - Predict the participation decision by using parameter estimates.
  - Calculate the pollock catch and salmon bycatch based on the predicted participations.
  - Predict based on the data of each year (2005-2013) and take averages.

# Counterfactual

Changes in pollock participation as result of earlier B season opening



# Counterfactual Total Changes in catch and bycatch as result of earlier B season opening



# Summary

- Harvester behavior depends on their alternative opportunities
  - Especially under ITQs, dynamic planning is possible.
  - Variable Quota Speed is one way of estimation without solving full dynamic programming.
    - Significantly improves fit over static, single-species models
- Biological/Economic Variables in other fisheries
  - Without them, the estimates may be biased due to omitted opportunity costs.









# Appendix

# Multi-fisheries problem

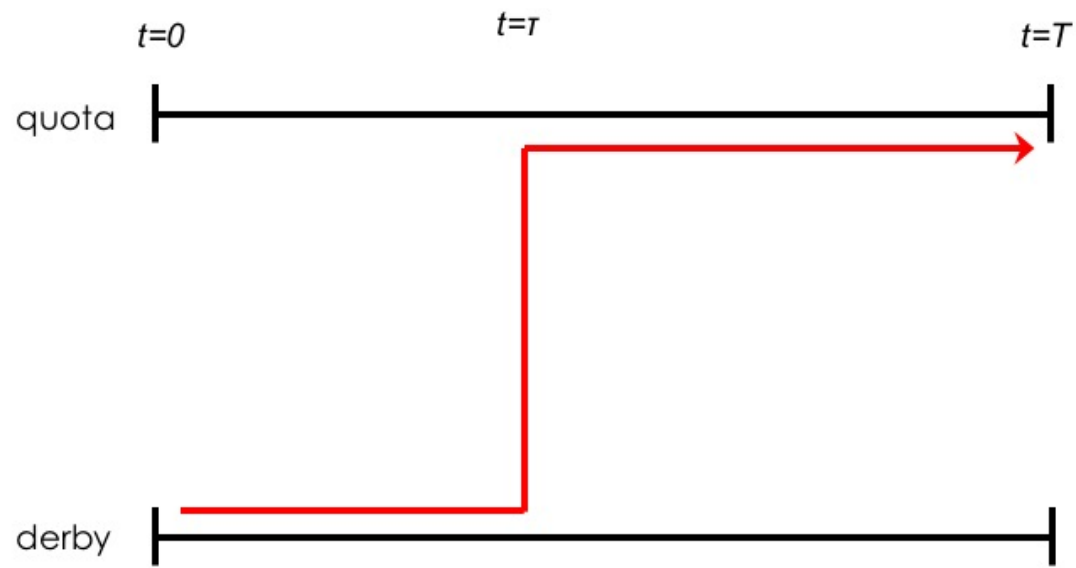
- Most of harvesters participate more than one species during a fishing season.
  - Seasonality
  - Portfolio: decrease the risk
    - Bycatch problem:
- Single fishery management may not be ideal
  - Management on a fishery cause effort spillover into another fishery.
  - Management effect given multiple alternative fisheries is under-researched
- In ITQ fisheries, the allocation is a dynamic problem.
  - Target choice problem is a dynamic problem.

# This study

- Model the process of dynamic fisheries choice.
  - Construct the seasonal model of fishery choice
  - Estimate a simple empirical model with dynamic variable
- Apply the model to a fleet in Alaskan Pollock fishery
  - Simulate the policy change with the model estimates, and evaluate the outcome

# Theoretical framework

- The harvesters problem (Single agent)
  - Given quota, maximize the seasonal profit from two fisheries : ITQ and TAC management fisheries (1 and 2)
  - Considers time-variant price and bycatch rate
  - Avoid bycatch for (possible) three reasons
    - Constrained by individual bycatch quota (e.g. PSC limit)
    - Social penalty
      - Contemporaneous bycatch (e.g. list of weekly dirty 20 vessels)
      - Cumulative bycatch (e.g. seasonal dirty 20 vessels)
  - Start in fishery 2 (TAC), and move to fishery 1 (ITQ)
    - Assume that the price of fishery 1 rises over time.



# Theoretical Model of dynamic fisheries choice

- Individual problem

$$\max \int_0^{\tau} (p^{f2} - c) e_{it}^{f2} dt + \int_{\tau}^T \{ [(p_t^{f1} - c) - \delta q_t^b] e_{it}^{f1} - \kappa z_{it} \} dt$$

- Subject to

$$\int_{\tau}^T e_{it}^{f1} dt \leq Q_i, \quad \int_{\tau}^T q_t^b e_{it}^{f1} dt \leq Q_i^b \quad (\text{main and bycatch quota})$$

$$\dot{z} = q_t^b e_{it}^{f1}, \quad (\text{changes in cumulative bycatch})$$

$$0 \leq e_{it}^{f1} \leq \bar{A}, \quad 0 \leq e_{it}^{f2} \leq \bar{A} \quad (\text{Capacity constraint})$$



# Theoretical Model of dynamic fisheries choice

- Set up Lagrangian and solve for  $e_{it}^{f1}$ ,  $e_{it}^{f2}$ , and  $\tau$ .

$$\begin{aligned} \mathcal{L} = & \int_0^\tau (p^{f2} - c) e_{it}^{f2} dt + && \text{Fishery 2} \\ & \int_\tau^T \{ [(p_t^{f1} - c) - \delta q_t^b] e_{it}^{f1} - \kappa z_{it} + \mu_t q_t^b e_{it}^{f1} \} dt && \text{Fishery 1} \\ & - \mu_T \int_\tau^T q_t^b e_{it}^{f1} dt + \int_\tau^T \dot{\mu} z_{it} dt && \text{Flow const.} \\ & + \lambda_1 \left( Q_i - \int_\tau^T e_{it}^{f1} dt \right) + \lambda_2 \left( Q_i^b - \int_\tau^T q_t^b e_{it}^{f1} dt \right) + && \text{Quota const.} \\ & \int_0^T \lambda_{3t} (\bar{A} - e_{it}^{f1}) dt + \int_0^T \lambda_{4t} (\bar{A} - e_{it}^{f2}) dt + \int_0^T \lambda_{5t} e_{it}^{f1} dt + \int_0^T \lambda_{6t} e_{it}^{f2} dt. && \text{Capacity const.} \end{aligned}$$

# Theoretical Model of dynamic fisheries choice

- Solution for effort in fishery 2

$$(p^{f2} - c) = \lambda_{4t} - \lambda_{6t}$$

- $\lambda_{4t}$ : LM on capacity constraint ( $< A$ ),  $\lambda_{6t}$ : LM on non-negative constraint.
- $\Rightarrow$  either  $\lambda_{4t}$  or  $\lambda_{6t}$  is positive.
- The LHS is positive  $\Rightarrow e_{it}^{f2} = A^-$

# Theoretical Model of dynamic fisheries choice

- Solution for effort in fishery 1

$$(p_t^{f1} - c) - \lambda_1 - [\delta + \kappa(T - t)]q_t^b - \lambda_2 q_t^b = \lambda_{3t} - \lambda_{5t}$$

- $\lambda_1$ : shadow cost of main quota,  $\lambda_2$ : shadow cost of bycatch quota
- $\lambda_{3t}$ : LM on capacity constraint ( $< A$ ),  $\lambda_{5t}$ : LM on non-negative constraint.
- $\Rightarrow$  either  $\lambda_{3t}$  or  $\lambda_{5t}$  is positive.
- If the LHS is positive,  $e_{it}^{f1} = A^-$
- If the LHS is negative,  $e_{it}^{f1} = 0$

# Theoretical Model of dynamic fisheries choice

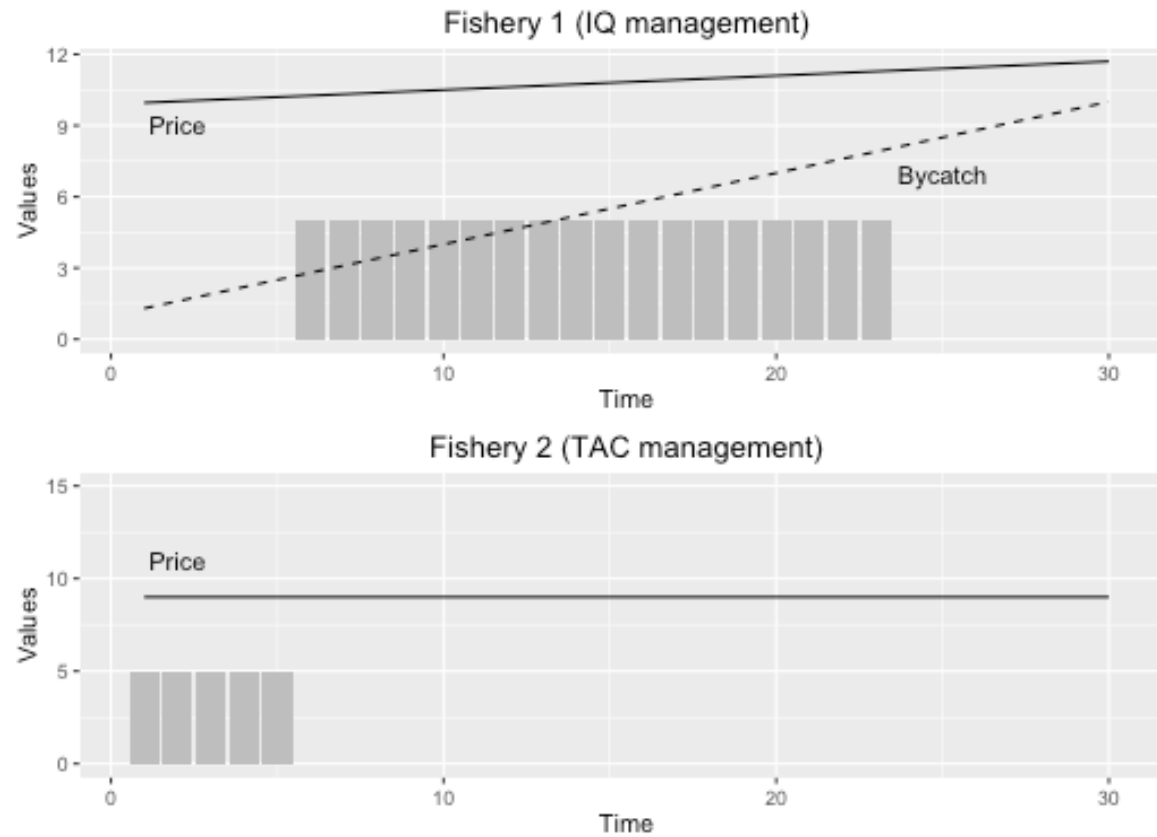
- Solution for  $\tau$ .

$$(p^{f2} - c) = (p_{\tau}^{f1} - c) - \lambda_1 - [\delta + \kappa(T - \tau)]q_{\tau}^b - \lambda_2 q_{\tau}^b$$

- Impose linear forms on price 1 and bycatch rate, and solve for  $\tau$ .

$$\tau = \frac{-[\beta^P - (\delta + \kappa T - \lambda_2)\beta^b + \kappa\alpha^b]}{2\kappa\beta^b} + \frac{\sqrt{[\beta^P - (\delta + \kappa T - \lambda_2)\beta^b + \kappa\alpha^b]^2 - 4\kappa\beta^b[\alpha^P - (\delta + \kappa T - \lambda_2)\alpha^b - p_2]}}{2\kappa\beta^b}$$

# Theoretical Prediction



# Empirical Model: Random Utility

- Utility: Pollock

$$\begin{aligned}
 U_{iyw}^P &= \alpha^P + \beta_1 \text{ExpRev}_{iyw} + \beta_2 \text{ExpChinPollRatio}_{iyw} \\
 &+ \beta_3 \text{SpeedQuotaPoll}_{iyw} + \beta_4 \text{SpeedQuotaChin}_{iyw} + \beta_5 \text{SwitchCost}_{itw} \\
 &+ \beta_6 A91_{iyw} + \beta_7 A91_{iyw} \times \text{SpeedQuotaChin}_{iyw} \\
 &+ \beta_8 A91_{iyw} \times \text{ExpChinPollRatio}_{iyw} + \sum_w \beta_w^P DW_w + \sum_i \beta_i^P DV_i + \varepsilon_{iyw}^P
 \end{aligned}$$

- *ExpRev*: Expected Revenue
- *ExpChinPollRatio*: Expected Chinook-Pollock Ratio, the contemporaneous bycatch measure
- *SpeedQuota*: Speedo of quota usage (next slide)
- *Switch Cost*: Dummy variable (1 if the choice of the week and the week before is different)
- *A91*: Dummy for Amendmend 91 (1 if >=2011)
- *DW*: Dummy variable for week of season (fixed effects)
- *DV*: Dummy variable for individual vessel (fixed effects)

# Empirical Model: Quota Speed

- How do we incorporate the dynamic cost of quota usage ( $\lambda_1$  &  $\lambda_2$ )?
- In theory, the shadow cost is time-invariant (at the  $t=0$ )
- In reality, the realization of the catch makes harvesters re-calculate the shadow value in each period.
  - If the usage is too fast (relative to the pace initially planned), the shadow value of the remaining quota gets higher
- We generate a variable which take into account this speed of quota usage.

# Weighted time left

