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- Will concentrate on the impact on Irish fisheries 1994-2004 (due primarily to data availability)
- ▶ Irish fishery is the largest in EU generates 700million annual revenue and employs approx. 11000 people (% fishermen).

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- ► Broad split between the scientific literature and the economics literature

Copepod



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Climate data

▶ Data used were the Hadley centre data obtained from the climatic research unit at the University of East Anglia

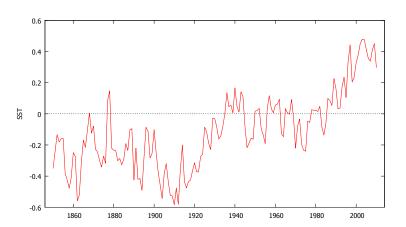
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- ► Average annual deviations in sea surface temperature for the North atlantic from the 1960–1990 annual average

North atlantic sea surface temperature anomalies 1850-2010



Data

Table: 1: Descriptive statistics of some key variables

	Landings	Value	Price	SST	Boats	Tonnes	Kw
Mean	4988.00	3138.00	1.53732	0.306273	1742.18	69141.0	213780
Median	912.500	1235.00	1.48829	0.329000	1689.00	64836.0	212680
Maximum	173022	39037.0	6.21739	0.479000	2105.00	86862.0	229093
Minimum	0	0	0.100206	0.104000	1436.00	59047.0	205956
St dev	17378.4	5516.99	0.972625	0.118978	210.925	10518.0	6862.50
CV	3.48405	1.75812	0.632675	0.388471	0.121069	0.152124	0.0321008
Skew	6.33863	3.77433	1.37914	-0.0673918	0.296907	0.666854	0.986092
Kurtosis	43.4422	16.7460	3.56991	-1.24287	-1.16279	-1.20906	0.0110204
N	478	478	450	11	506	506	506

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- compare two situations:
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 - supply curve in absence of climate change (counterfactual)
- impact of climate change on the supply curve (leftward or rightward shift)

The model

$$y_{it} = \alpha + x'_{it}\beta + D'_{i}\gamma + \mu_i + \nu_{it}, i = 1 \dots N, t = 1 \dots T$$

- ▶ y_{it} are log landings of fish at port i in period t
- \mathbf{x}_{it}' is a $1 \times K$ vector of explanatory variables including price; sea surface temperature (SST), fishing effort variable such as the number of boats, tonnage and energy consumption of the fleet (kW)
- D_i' is a $1 \times J$ vector of dummy variables representing time independent policy factors such as whether or not a port is a designated landing port of a particular type of fish (demersal, pelagic or deepwater species)

Initial results

Table: 2: Pooled OLS estimates of log landings

	Dep	endent variable is lo		
	Model 1-1	Model 1- 2	Model 1-3	Model 1-4
Intercept	8.05842***	22.5155***	7.66907***	28.9942***
	(2.50158)	(7.118)	(1.7425)	(10.2166)
Price	-0.859157***	-0.633377***	-0.625002***	-0.869782***
	(0.0660971)	(0.0475912)	(0.047486)	(0.0662509)
SST	-1.03597	1.34411	-0.819544*	2.08191
	(0.705519)	(1.17201)	(0.491512)	(1.68299)
Boats	-0.00140648*	-0.0069146**	-0.00106308**	-0.00963031**
	(0.0007676)	(0.00298146)	(0.000534918)	(0.0042792)
Tonnes	-1.18828e-05	-8.47124e-05*	-1.336e-05	-0.000118287*
	(2.16963e-05)	(4.5569e-05)	(1.51121e-05)	(6.54252e-05)
Kilowatts	1.84097e-05	4.78035e-05*	`1.24538e-05´	7.24317e-05*
	(1.76766e-05)	(2.76691e-05)	(1.23154e-05)	(3.97135e-05)
Deepwater	` ,	`0.662316***	0.661851***	` ,
(dummy)				
. ,,		(0.12967)	(0.129869)	
Demersal		0.886725***	0.890996***	
(dummy)				
()		(0.107515)	(0.107657)	
Pelagic		1.16137***	1.16729***	
(dummy)		1.10101	1.10125	
(==))		(0.124929)	(0.125088)	
Commercial		0.00146793*	(0.125000)	0.00186305
Commercial		(0.000885219)		(0.00127148)
Drift		-0.011561**		-0.0162768**
Dille		(0.00540887)		(0.0077639)
Draft		0.00209471		0.00220587
Bidit		(0.00232591)		(0.00334156)
Other		Collinearity		Collinearity
Rod		-6.94695e-05		-9.20162e-05
		(8.46415e-05)		(0.000121591)
R-squared	0.279284	0.656935	0.652723	0.287045
F.	34.41076	69.73439	103.6100	19.68331
Akaike criterion	1529.772	1209.725	1207.216	1532.899

Pooled OLS

Table: 3: Pooled OLS estimates with interaction terms

		onondont variable is I	og of landings in each	5350
	Model 2-1	Model 2-2	Model 2-3	Model 2-4
Intercept	7.98116*	5.81039**	8.83419***	7.72022***
Price	(4.6444) -0.265708 (2.40907)	(2.5767) 0.806916 (0.531076)	(0.224236) 0.610336* (0.337276)	(0.163651) 0.413664* (0.234199)
SST	-0.972093	-0.99974	-1.18942*	-1.14964***
Boats	(0.699947) 0.000820133 (0.00141241)	(0.698575) -0.00030897 (0.000835489)	(0.60629)	(0.420759)
Tonnes	0.00141241	-2.13266e-05		
Kilowatts	(3.6592e-05) -6.56949e-06 (3.06359e-05)	(2.16866e-05) 2.33575e-05 (1.75701e-05)		
Deepwater (dummy) Demersal (dummy) Pelagic (dummy)	, ,	,		0.645844*** (0.127971) 0.894177*** (0.105985) 1.1593*** (0.123173)
Price x Boats	-0.00167808** (0.000781037)	-0.00100472*** (0.000317824)	-0.000884398*** (0.000205557)	-0.000629548*** (0.000143131)
Price x Tonnes Price x Kilowatts	`-1.84726e-05' (1.7471e-05) 1.64797e-05 (1.38445e-05)			
R-squared F	0.297598 23.35572	0.295184 30.92207	0.292105 61.34551	0.661466 144.2636
Akaike criterion	1524.189	1521.733	1517.695	1191.743

Fixed effects with interaction terms

Table: 4: Initial fixed effect results with interaction terms

	Dependent vari Model 1	able is log of landing Model 2	s in each case Model 3
Intercept	7.08214*** (1.69301)	7.49057*** (1.37976)	7.82651*** (0.143842)
Price	0.940891 (1.0806)	0.473878 (0.403611)	0.0339317 (0.170926)
SST	-0.614757**	-0.650699**	-1.04657***
Boats	(0.000731436) 0.00118849	(0.312165) 6.60897e-05	(0.291272)
Tonnes	(0.000731436) 1.37536e-05 (1.35083e-05)	(0.000555872) -1.5096e-05* (8.39063e-06)	
Kilowatts	-1.12839e-05 (9.48463e-06)	5.45469e-06 (5.93546e-06)	
Price x Boats	-0.0011425*** (0.000417385)	-0.000451681 (0.000280314)	-0.000184591 (0.000115275)
Price x Tonnes	-1.71494e-05*** (5.46512e-06)	((/
Price x Kilowatts	9.05784e-06* (4.99573e-06)		
R-squared	0.859563	0.858067	0.855912
Akaike criterion	45.73141 889.8036	47.17937 890.5698	49.62531 891.3532

Table: 5: Final Fixed effect results with interaction terms

			g of landings in each	
	Model 3-1	Model 3-2	Model 3-3	Model 3-4
Intercept	7.75096***	6.54658***	8.38101***	5.866***
	(0.149922)	(0.565432)	(0.646848)	(1.54451)
Price	0.825942*	1.53886**	`0.609881´	1.8635**
	(0.486612)	(0.582014)	(0.632946)	(0.901542)
SST	-0.911326***	-0.631538**	-0.702119**	-0.650686**
	(0.300784)	(0.325047)	(0.331533)	(0.308)
Boats	(,	0.00065369	(,	0.00085261
		(0.000296016)		(0.000624294)
Tonnes		` ,	-9.71426e-06	`4.84251e-06´
			(7.82488e-06)	(9.71967e-06)
Price x Boats	-0.000404418**	-0.000761901**	-0.000430117**	-ò.000857873**
	(0.00017095)	(0.000234839)	(0.000183848)	(0.000367361)
Price x Tonnes	-5.58606e-06*	-7.23007e-06*	-2.13185e-06	-9.45225e-06*
	(3.21452e-06)	(3.28454e-06)	(5.2109e-06)	(5.20795e-06)
R-squared	0.856991	0.858718	0.857909	0.858786
ΪF	48.91903	48.50280	48.18111	47.45922
Akaike criterion	889.9687	886.5022	889.0724	888.2852

Instrumental variable estimates

Table: 6: Comparison of Instrumental variables estimates

			able is log of land	
Intercept	Pooled OLS 8.28119*** (0.346776)	Pooled IV 7.107*** (0.505161)	Panel IV 7.54397*** (0.247395)	Panel IV with interaction terms 7.59934*** (0.620370)
Price	-0.814515*** (0.162251)	0.268053 (0.337303)	-0.0113763 (0.240330)	0.483649 (0.584482)
SST	0.14236 (0.442367)	-1.46908** (0.57124)	-1.49339*** (0.555274)	-0.932147** (0.379489)
Time	(/	Instrument	Instrument	Instrument
Boats Tonnes		Instrument	Instrument	Instrument Instrument
kw				Instrument
Price x Boats				-0.000184778
				(0.000294366)
Price x Tonnes				-4.62632e-06 (4.15688e-06)
R-squared	0.262724	0.175104	0.045613	0.084063
Akaike criterion	79.64280 1533.994	3.325332 6785.962	31.9077	32.4512

Two scenarios considered:

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 - Predicted landings and value of landings (revenue) 1994-2004 without ocean warming (counterfactual)
- Difference in predicted values calculated for each port
- Value of difference used as an estimate of damage cost of climate change

Top 10 most affected ports

Table: 12: Rank ordering of ports by percentage revenue lost

Rank	Port	% change in revenue from counterfactual
1	Wicklow	-40.69272304
2	Portmagee	-36.67449513
3	Bantry	-33.777793
4	Moville	-33.29792883
5	Fenit	-32.80437168
6	Achill	-32.57707588
7	Burtonport	-32.39876129
8	Aran Islands	-31.41672685
9	Helvick	-31.40522437
10	Dunmore East	-31.38607148

Bottom 10 most affected ports

Table: 12: Rank ordering of ports by percentage revenue lost

Rank	Port	% change in revenue
		from counterfactual
36	Dingle	-29.08157479
37	Baltimore	-28.79389382
38	Wexford	-28.24628323
39	Bunbeg	-20.23807779
40	Carlingford	-19.9456652
41	Ballyglass	-17.20571098
42	Lettermore/Lettermullen	-15.71796686
43	Kincasslagh	-15.66304798
44	Cleggan/Clifden	-15.63034779
45	Foynes	-15.57798139
46	Galway	-13.03553762

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- ▶ In terms of the Irish economy as a whole 436 million euros in damages over 11 years is about 0.29 percent of Ireland's GDP in the year 2004
- ► Are adaptation strategies possible? Yes

► Currently exploring use of a synthetic control approach (Abadie and Gardeazabal 2003, Abadie, Diamond, and Hainmueller, 2010, Abadie, Diamond, and Hainmueller, 2011) and placebo treatments to place confidence intervals on deviations from counterfactual

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- Development of a portfolio based policy model for effort reallocation

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- ► The impact has been detrimental and this result differs from that of previous studies on climate change and fisheries
- Result confirms scientific research describing northward movements of copepods and increased catches in the arctic northern subarctic waters and reduced catches in the southern subarctic and north atlantic
- ► There is sufficient data to tackle the impact of climate change empirically without resorting to simulation or speculation

Thanks for listening!

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