

# Food Policy in a Warming World

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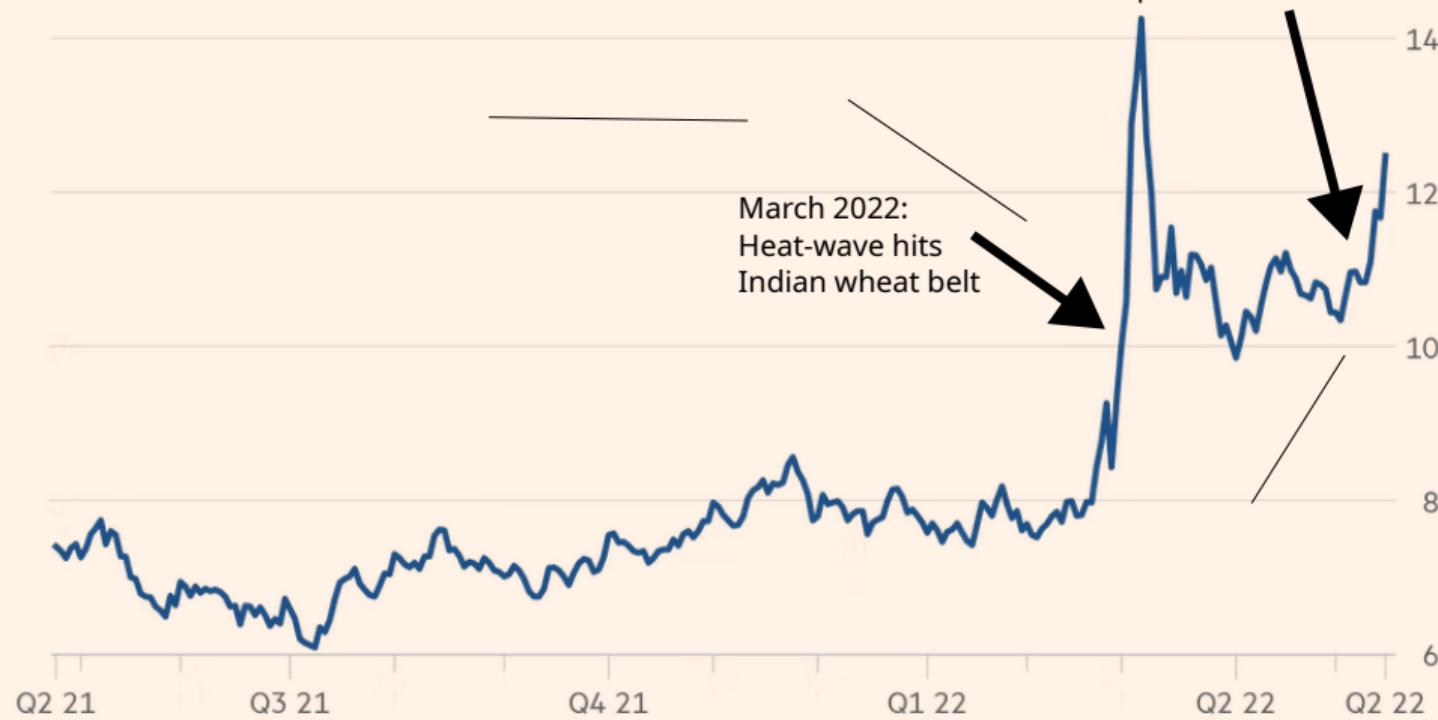


## Chicago wheat (\$/bushel)



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May 2022:  
Government announces  
export ban



Source: Bloomberg

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# Three perspectives on the export ban

**Indian Ministry of  
Commerce & Industry**

May 13 statement

Goal is to combat  
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**Industry analyst Sonal  
Verna**  
May 17 *CNN Business*

“These measures could  
end up **exacerbating food  
price pressures globally.**  
[The effects will] be felt  
disproportionately by  
low-income developing  
countries.”

## Question

- Trade can facilitate climate adaptation
  - But trade policy responds to shocks
- For India, extreme heat → policy → distributional effects
  - Both within and across countries
- **How does trade policy affect global adaptation to climate shocks?**

# This paper

## ① **Theory:** model of agricultural policy, trade, production, climate

- Ambiguous effects of climate shocks on policy
- Government weighs constituent welfare against fiscal revenue

## ② **Empirics:** new global data by country, crop, year (1980-2011)

- Domestic shocks lead to consumer aid, especially during elections
- Foreign shocks lead to producer aid, possibly offsetting consumer aid
- Persistent effects, including for longer-run changes

## ③ **Quantification:** empirical estimates → climate damages

- Heatwaves in a more volatile world
- Damages for 2100 in a warmer world

# Contributions

## ① Climate damages and trade with **endogenous government policy**

- Mendelsohn et al. 1994, Deschênes & Greenstone 2007, Lobell & Field 2007, Schlenker & Roberts 2009, Lobell et al. 2011, Ortiz-Bobea et al. 2021
- Costinot et al. 2016, Baldos et al. 2019, Gouel and Laborde 2021, Carleton et al. 2022, Hultgren et al. 2022, Rudik et al. 2022, Cruz & Rossi-Hansberg 2023, Nath 2023

## ② Trade policy and politics for **climate adaptation**

- Grossman & Helpman 1994, Goldberg & Maggi 1999, Fajgelbaum et al. 2020, Adão et al. 2023
- Johnson 1953, Putnam 1988, Bagwell & Staiger 1999, Grossman & Helpman 1995, Ossa 2014
- Johnson 1991, Anderson 2009, Anderson & Masters 2009, Anderson et al. 2013, Bates 2014

# Theory

# Trade policy with shocks

$$\underbrace{Q(p^*)}_{\text{consumption}} = \underbrace{Y(p^*, \omega)}_{\text{production}} + \underbrace{M(\alpha, p^*, \omega')}_{\text{imports}}$$

$$\alpha^* = \arg \max \left\{ \lambda^C CS(p^*) + \lambda^P PS(p^*, \omega) + \lambda^G G(\alpha, p^*, \omega') \right\}$$

- ① Domestic/foreign redistribution (terms-of-trade)
- ② Consumer/producer redistribution

# Trade policy in response to shocks

## ① Revenue focus: $\lambda^G \gg \lambda^C, \lambda^P$

- $\alpha^*$  increases in  $\omega$ , decreases in  $\omega'$
- Shock  $\uparrow$ , imports  $\uparrow$ , subsidy cost  $\uparrow$ , tax benefit  $\uparrow$  (terms-of-trade)

## ② Constituent focus: $\lambda^C \gg \lambda^G$ or $\lambda^P \gg \lambda^G$

- $\alpha^*$  decreases in  $\omega$ , increases in  $\omega'$
- Import subsidy helps  $(C, P')$ , hurts  $(P, C')$
- Shock  $\uparrow$ , imports  $\uparrow$ , hurt  $P \downarrow$ , hurt  $C' \uparrow$

## Data and measurement

# Annual data for 80 crops, 81 countries (1980-2011)

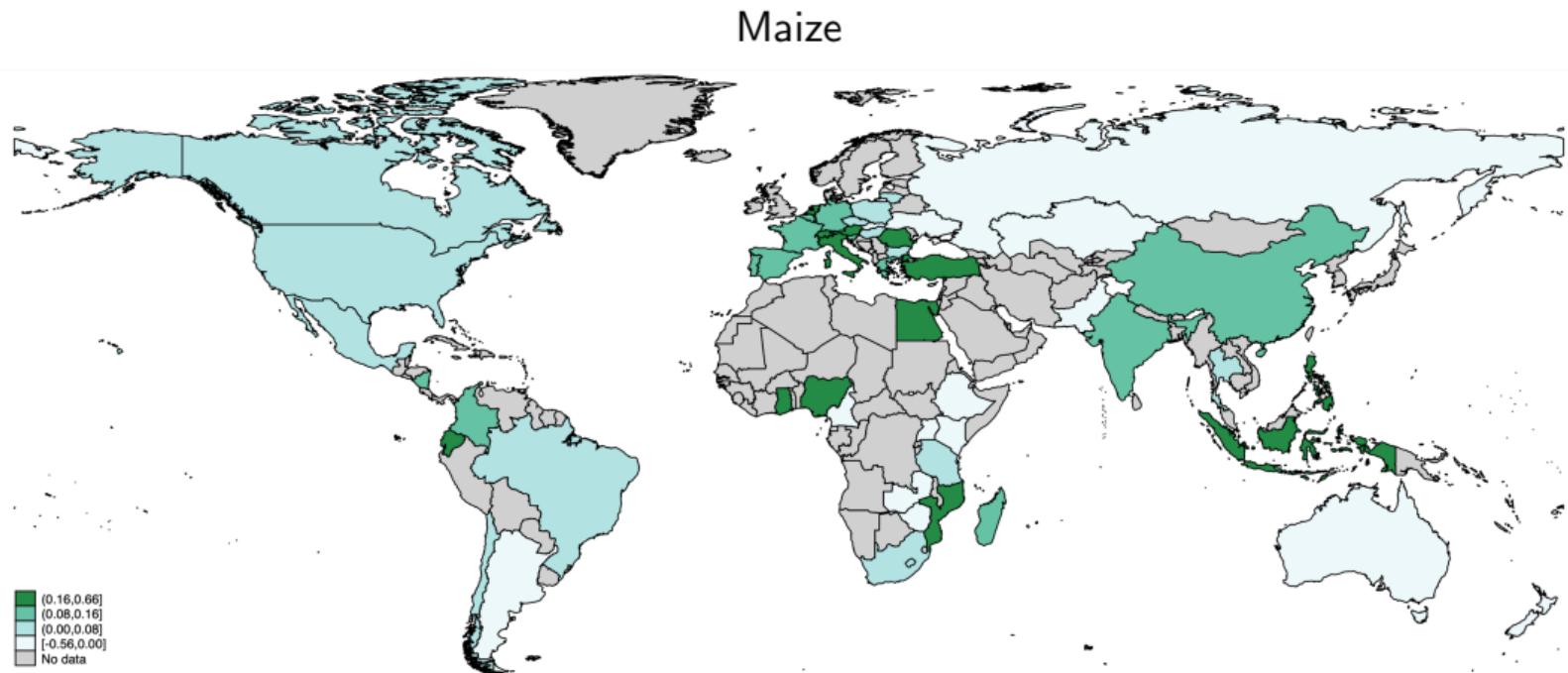
- Agricultural policy, production, trade
  - Nominal rate of assistance (World Bank)
  - Production, exports, imports (FAO)
- Climate shocks
  - Extreme temperatures (ERA-5)
  - Crop-specific temperature sensitivity (FAO EcoCrop)
  - Geography of agricultural production (Earthstat)

## Policy: nominal rate of assistance

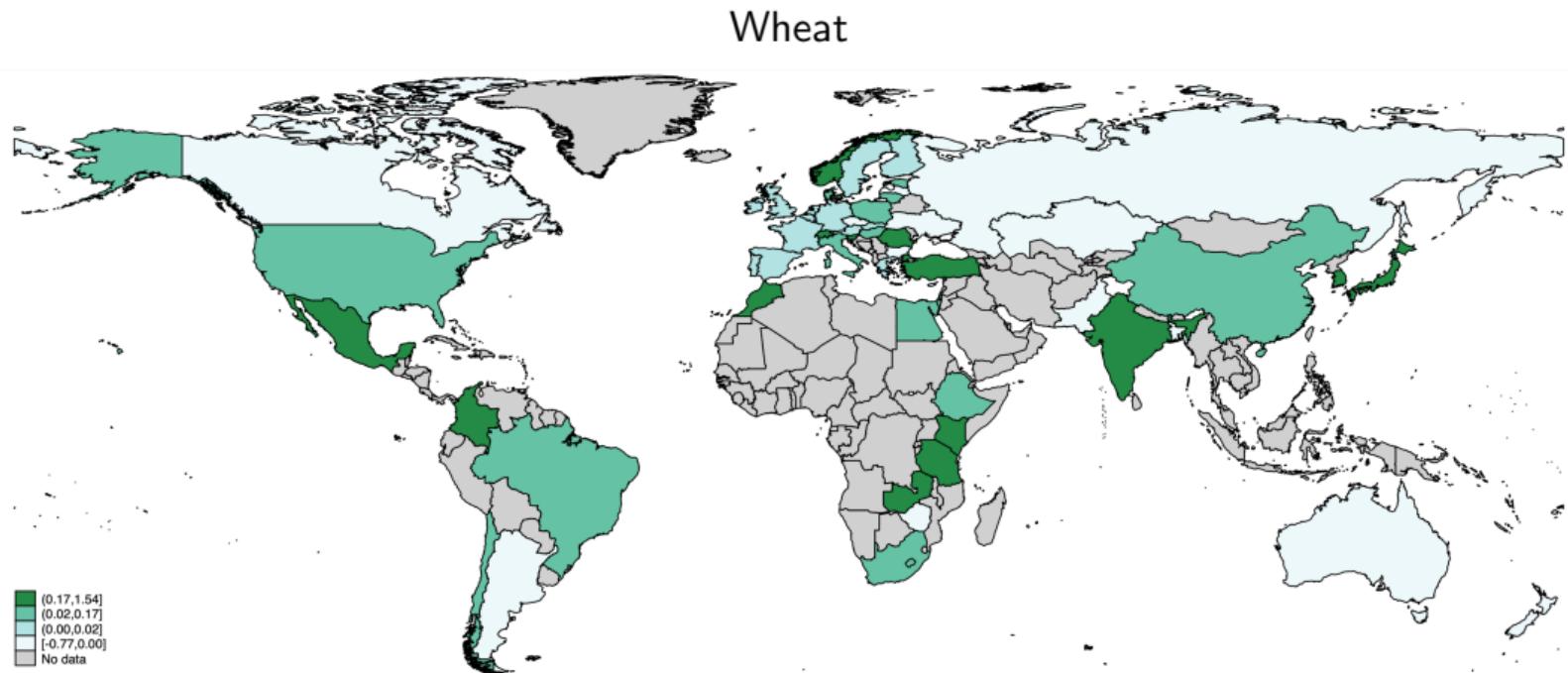
$$\text{NRA}_{\ell kt} = \frac{P_{\ell kt}^d - P_{\ell kt}^w}{P_{\ell kt}^w}$$

- Domestic vs. world price by country  $\ell$ , crop  $k$ , year  $t$ 
  - “Distortions to Agricultural Incentives” (Anderson & Valenzuela 2008)
  - Unbalanced panel of 82 countries, 80 crops, 85% of production (1955-2011)
  - Pro-consumer if  $\text{NRA}_{\ell kt} < 0$
- Captures multiple dimensions of policy
  - Quantity instruments, input-market interventions
  - Exchange-rate manipulation, temporary support, export bans
  - Robustness: tariff measures from TRAINS

# Average nominal rate of assistance (2001-2010)

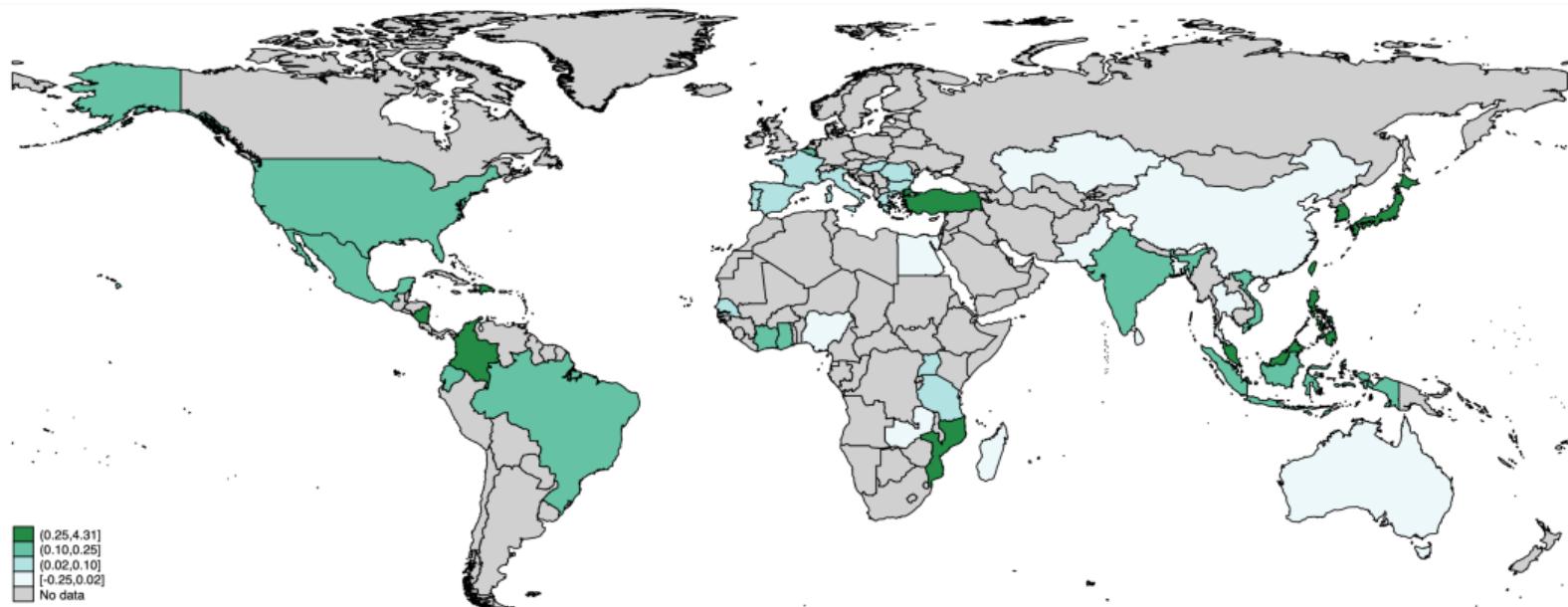


# Average nominal rate of assistance (2001-2010)



# Average nominal rate of assistance (2001-2010)

Rice



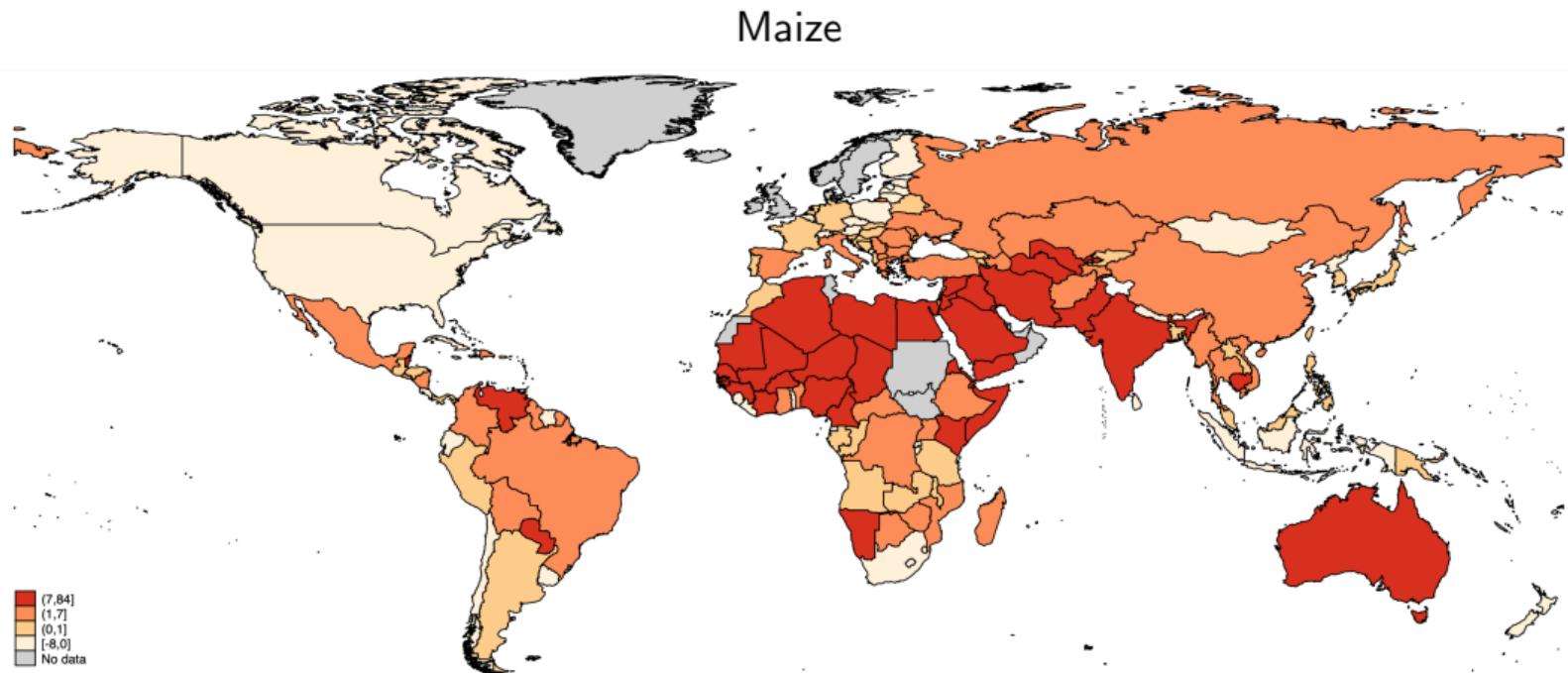
## Shocks: extreme heat exposure

$$\text{ExtremeHeat}_{\ell kt} = \sum_{c \in \ell} \frac{\text{Area}_{ck}}{\sum_{c' \in \ell} \text{Area}_{c'k}} \cdot \text{DegreeDays}_{ct}(T_k^{\max})$$

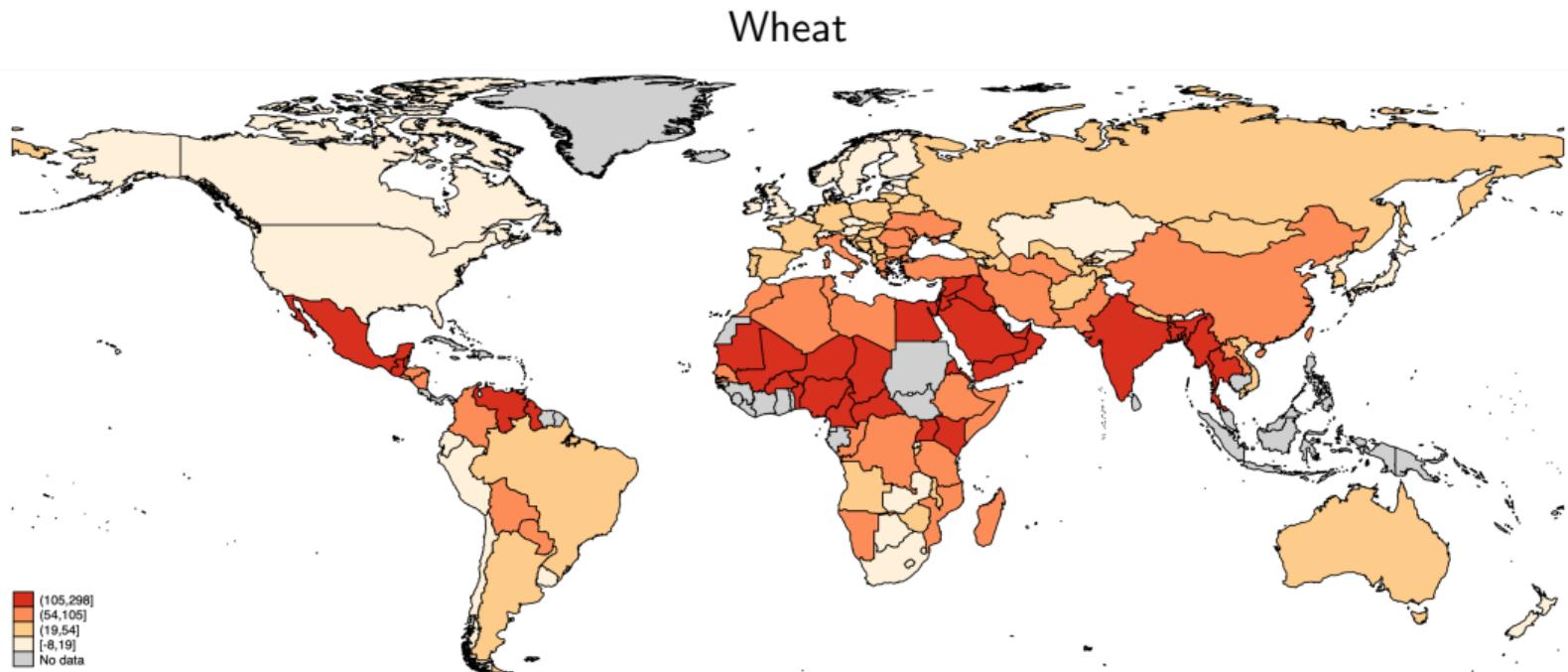
$$\text{ForeignExtremeHeat}_{\ell kt} = \sum_{\ell' \neq \ell} \text{ImportShare}_{\ell' \rightarrow \ell k} \cdot \text{ExtremeHeat}_{\ell' kt}$$

- Growing degree days by country  $\ell$ , crop  $k$ , year  $t$ , cell  $c$ 
  - Variation in weather, plant physiology, and crop geography

# Change in extreme heat exposure (1980-2010)

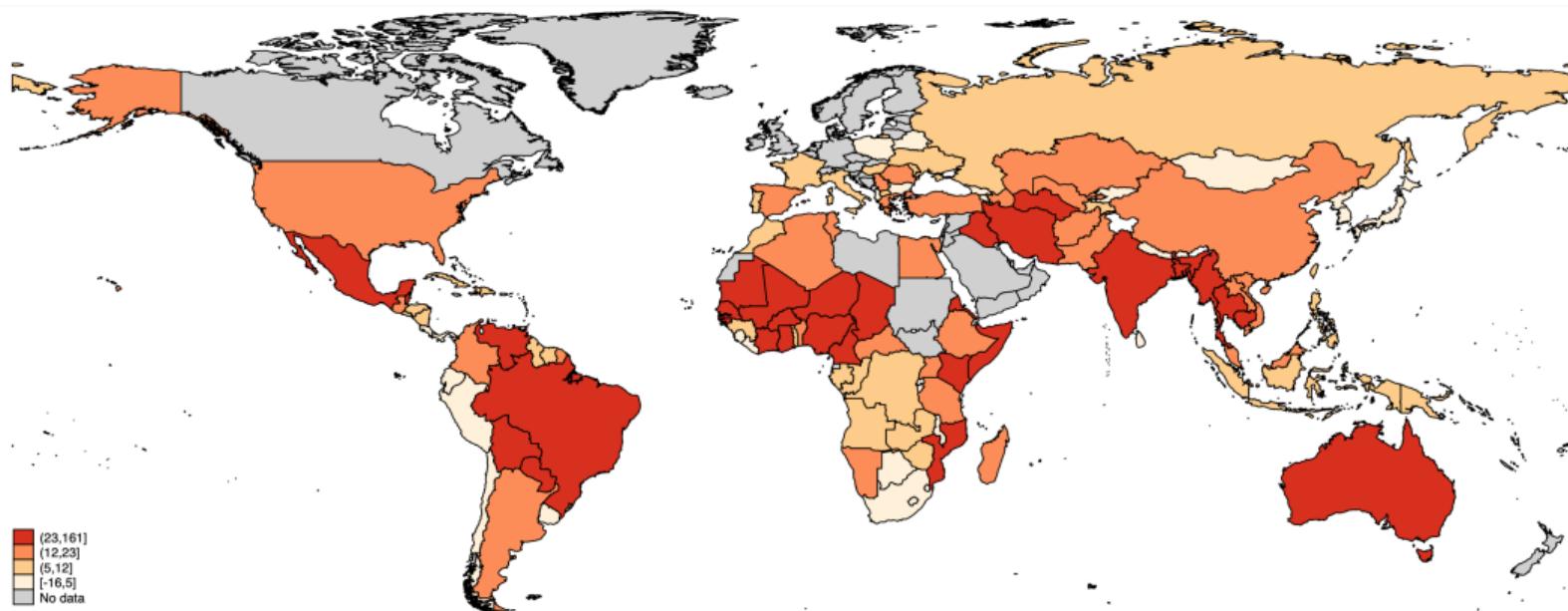


# Change in extreme heat exposure (1980-2010)



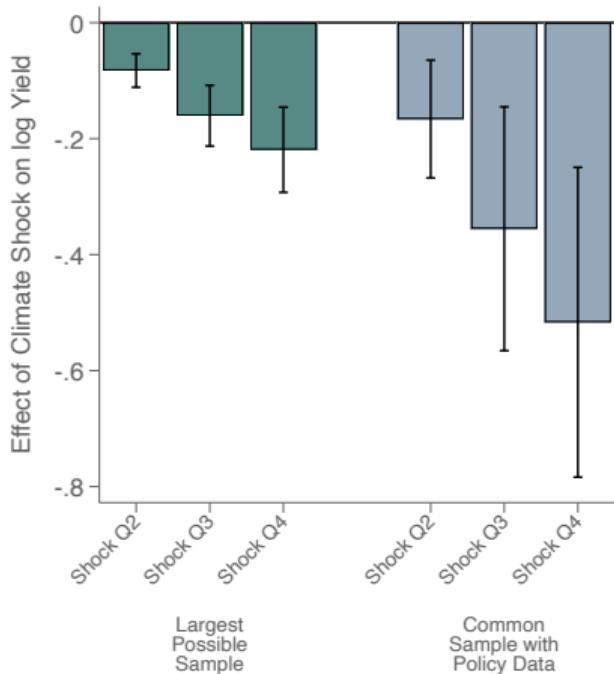
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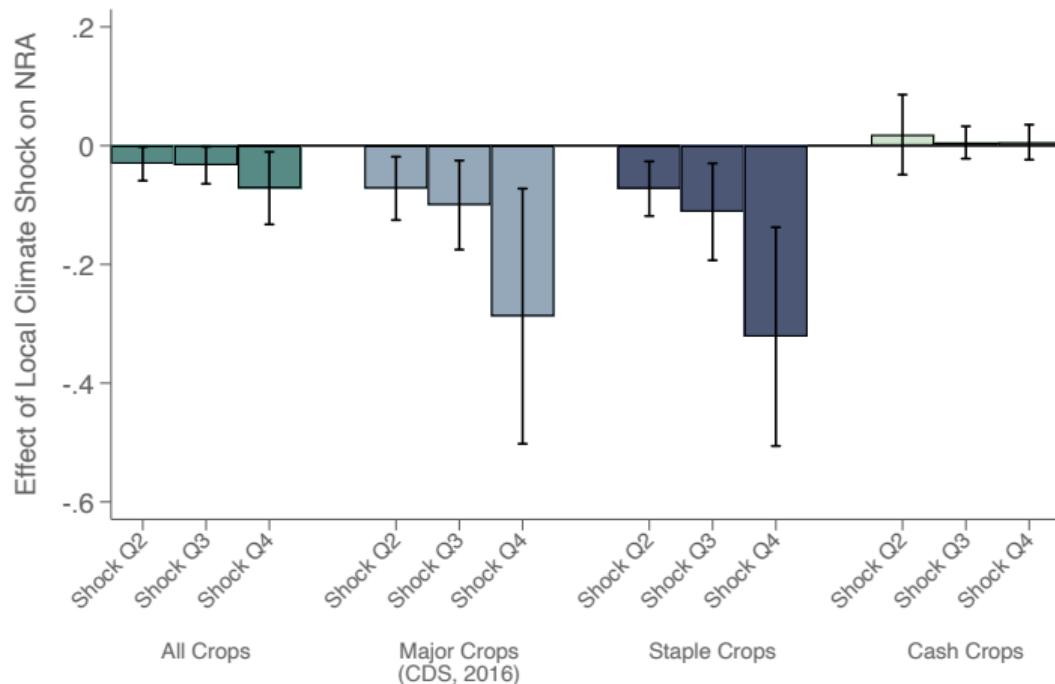
## Empirical results

## Extreme heat lowers yields (quartile effects)



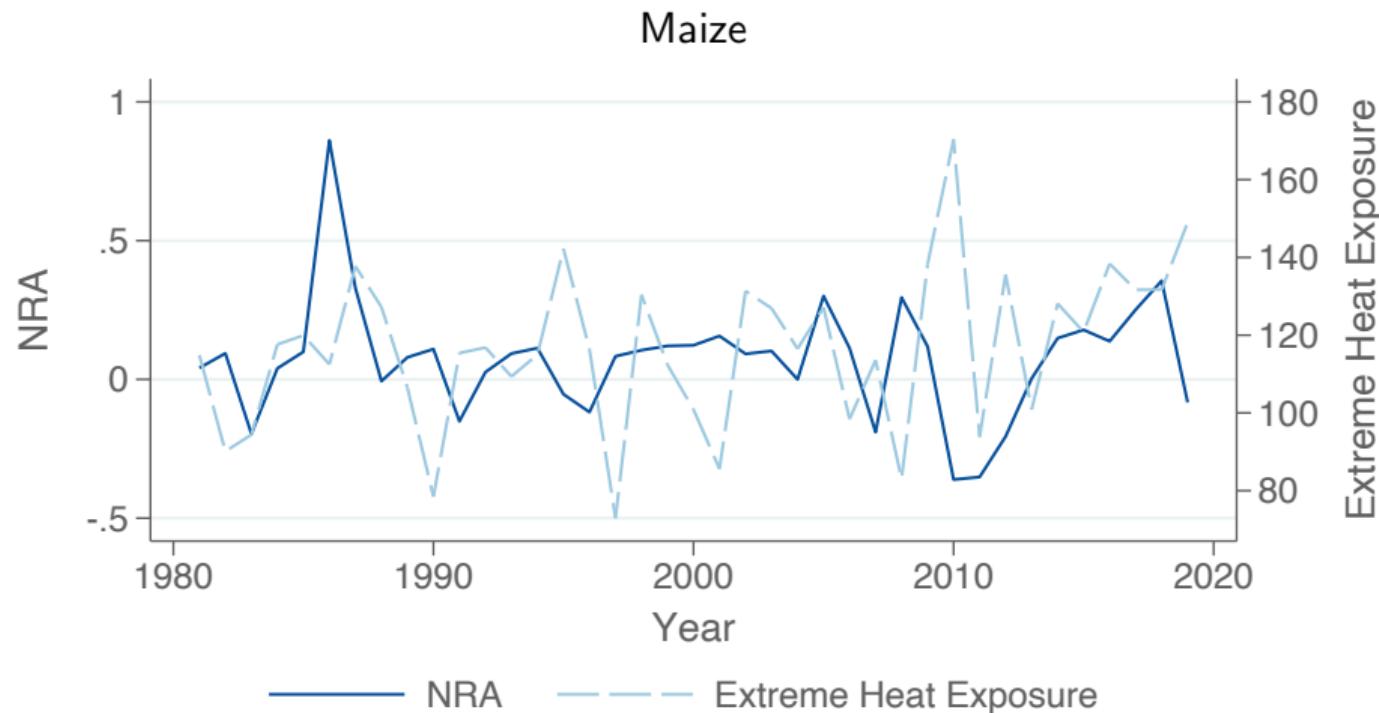
$$\log(\text{yield}_{\ellkt}) = f(\text{ExtremeHeat}_{\ellkt}) + \gamma_{\ell t} + \delta_{kt} + \mu_{\ell k} + \varepsilon_{\ellkt}$$

## Result 1: domestic shocks induce pro-consumer policy

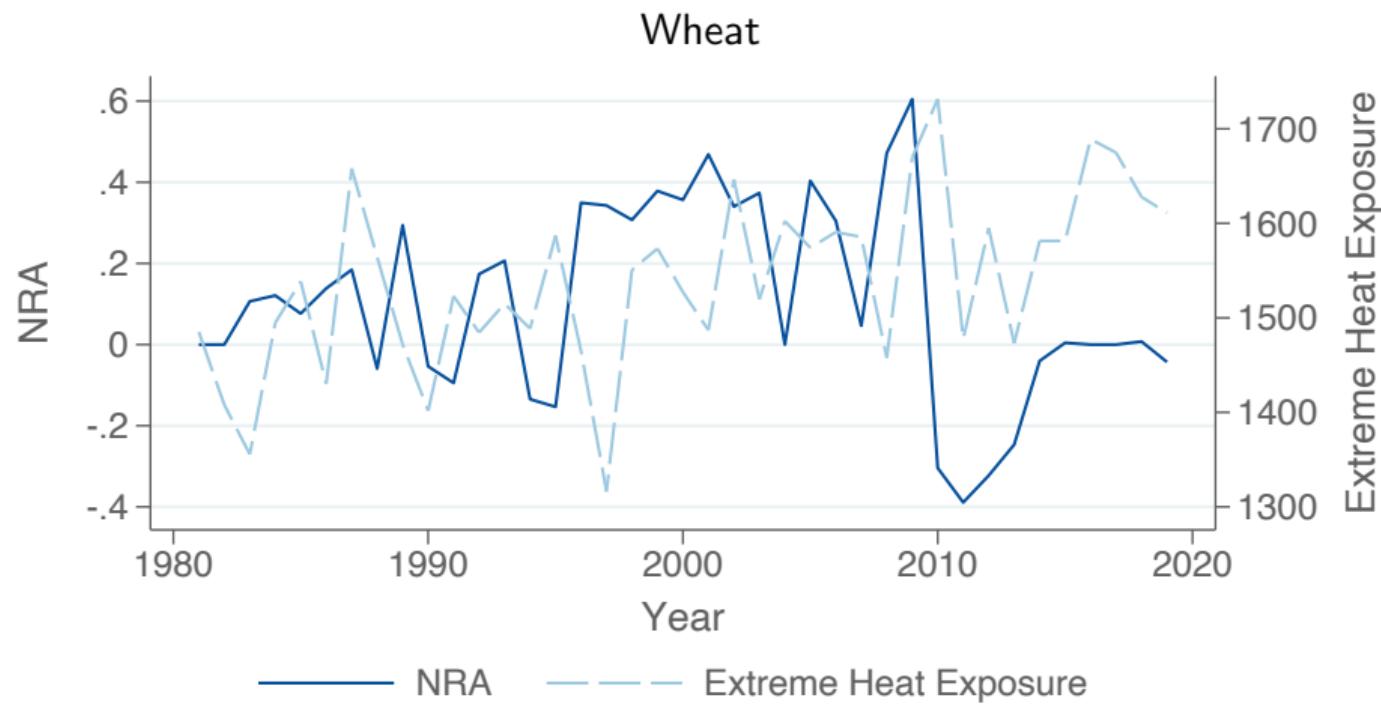


$$\text{NRA}_{\ell kt} = g(\text{ExtremeHeat}_{\ell kt}) + \gamma_{\ell t} + \delta_{kt} + \mu_{\ell k} + \varepsilon_{\ell kt}$$

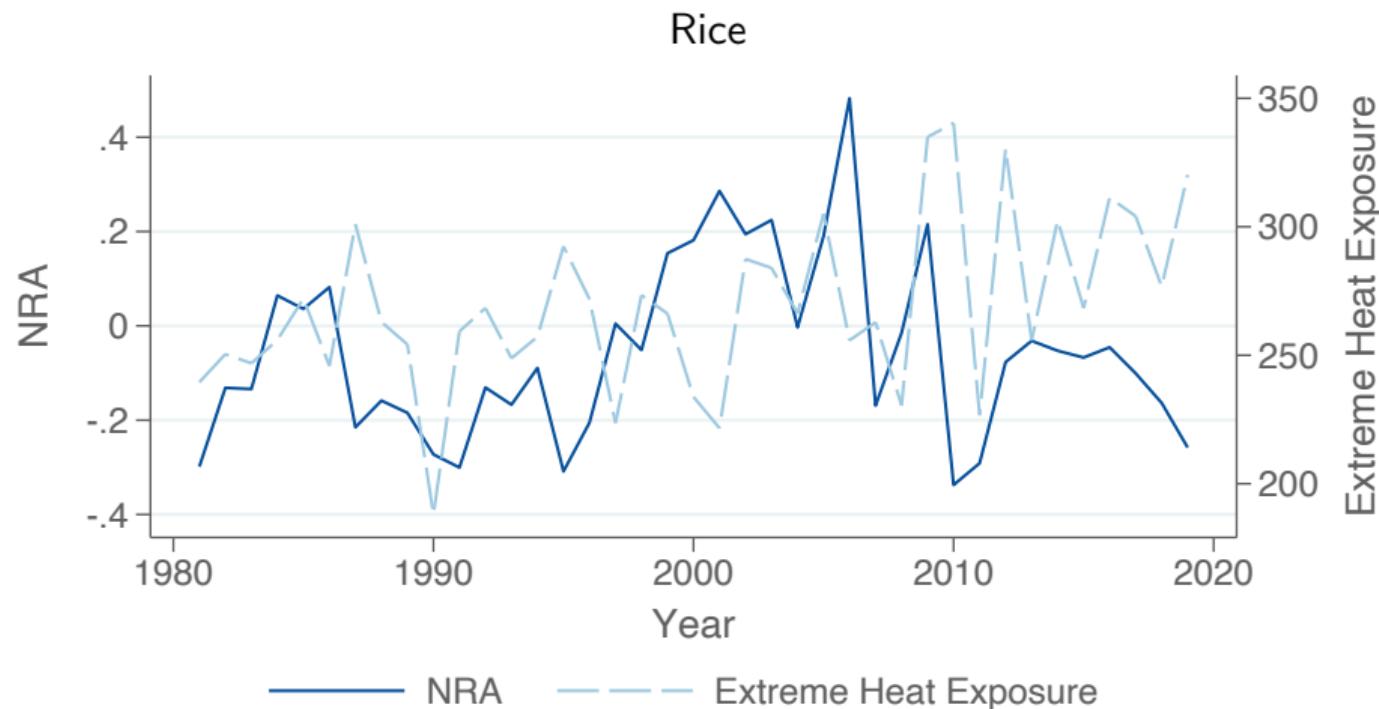
## Example: staples in India



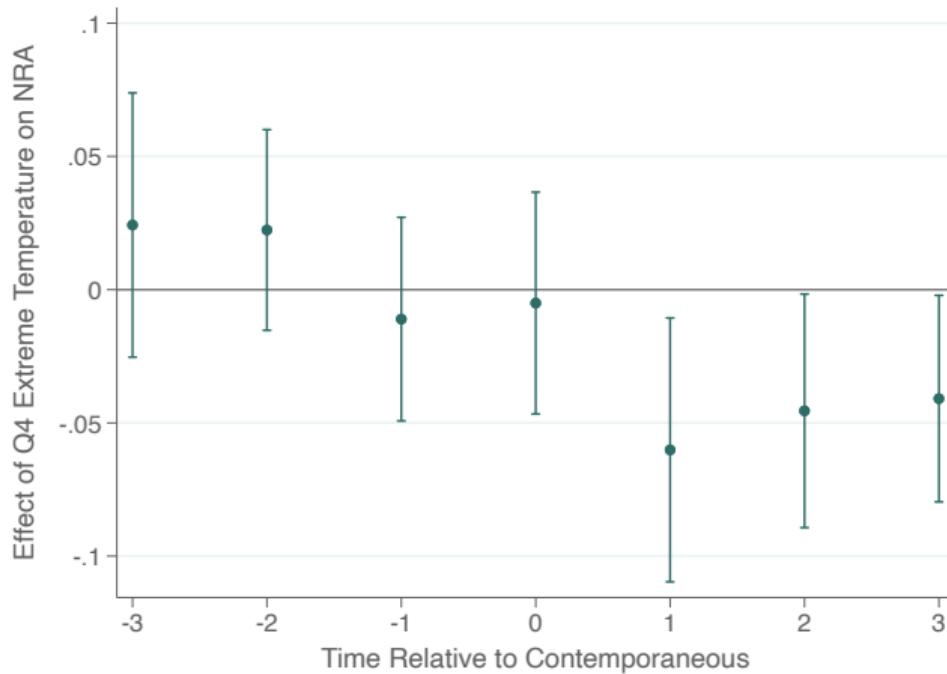
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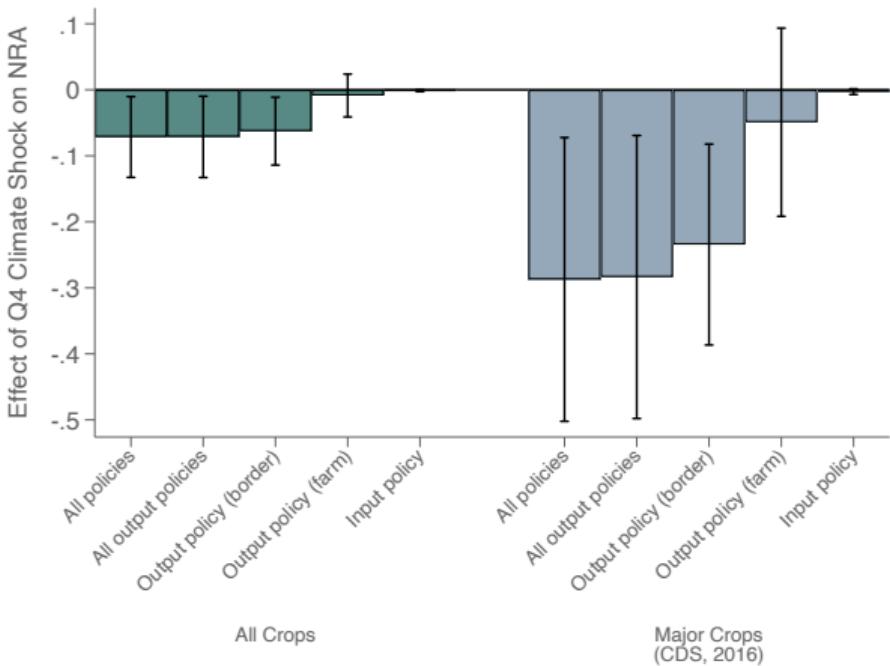


## The effects are persistent



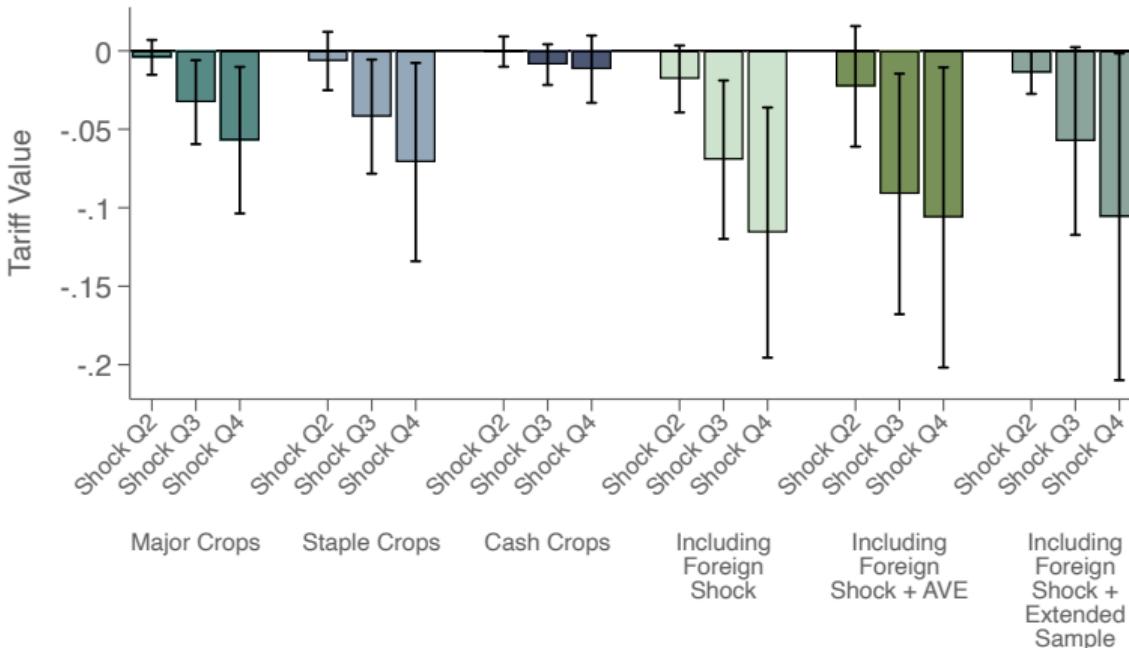
$$\text{NRA}_{\ell kt} = \sum_{s=-3}^3 g(\text{ExtremeHeat}_{\ell kt+s}) + \gamma_{\ell t} + \delta_{kt} + \mu_{\ell k} + \varepsilon_{\ell kt}$$

## The effects are concentrated in border policies



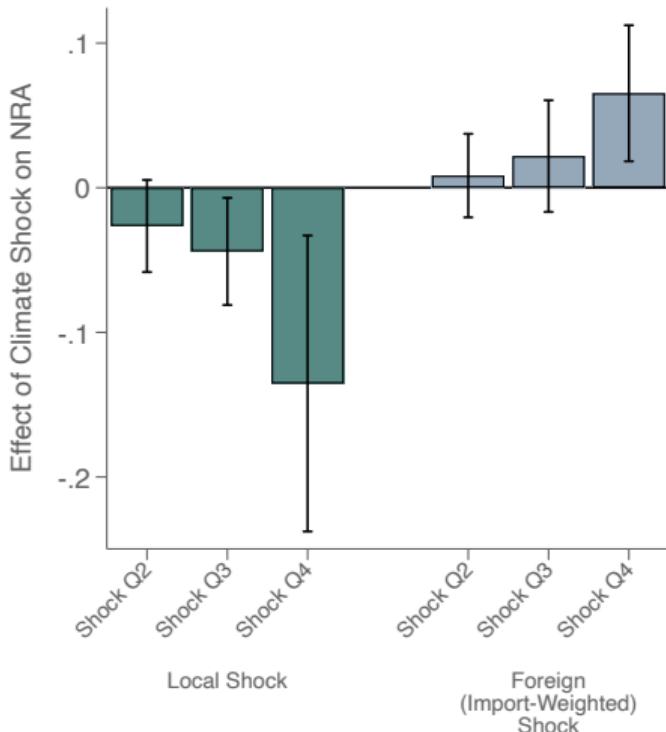
$$\text{NRA}_{\ell kt}^{\text{component}} = g(\text{ExtremeHeat}_{\ell kt}) + \gamma_{\ell t} + \delta_{kt} + \mu_{\ell k} + \varepsilon_{\ell kt}$$

# The effects appear in direct tariff measures (TRAINs)



$$\text{Tariff}_{\ell k t} = g(\text{ExtremeHeat}_{\ell k t}) + \gamma_{\ell t} + \delta_{k t} + \mu_{\ell k} + \varepsilon_{\ell k t}$$

## Result 2: foreign shocks induce pro-producer policy



$$\text{NRA}_{\ell kt} = g(\text{ExtremeHeat}_{\ell kt}) + h(\text{ForeignExtremeHeat}_{\ell kt}) + \gamma_{\ell t} + \delta_{kt} + \mu_{\ell k} + \varepsilon_{\ell kt}$$

## Result 3: stronger effects at decadal frequency ( $N_{\text{full}} = 1,951$ )

Sample:	Full Sample	Major Crops	Staple Crops	Cash Crops	
Years of Extreme Heat (Local)	-0.0242** (0.0111)	-0.0252** (0.0110)	-0.0620** (0.0259)	-0.0758** (0.0266)	-0.0311 (0.0400)
Years of Extreme Heat (Foreign Import-Weighted)		0.0179* (0.00969)	0.0254* (0.0123)	0.0237 (0.0127)	0.0272 (0.0185)

## Result 4: stronger effects before elections ( $N_{full} = 15,860$ )

	Full Sample	Major Crops	Staple Crops	Cash Crops
Q2 Extreme Heat Exposure x No Election	-0.0429* (0.0222)	-0.0724 (0.0445)	-0.0509 (0.0390)	-0.0259 (0.0486)
Q3 Extreme Heat Exposure x No Election	-0.0138 (0.0236)	-0.0788 (0.0654)	-0.0561 (0.0719)	-0.0182 (0.0163)
Q4 Extreme Heat Exposure x No Election	-0.0172 (0.0374)	-0.0948 (0.101)	-0.104 (0.0946)	-0.0126 (0.0216)
Q2 Extreme Heat Exposure x Election	-0.0120 (0.0172)	-0.0689** (0.0315)	-0.0820** (0.0316)	0.0680 (0.0600)
Q3 Extreme Heat Exposure x Election	-0.0363 (0.0230)	-0.110** (0.0543)	-0.145** (0.0627)	0.0217 (0.0223)
Q4 Extreme Heat Exposure x Election	-0.108** (0.0490)	-0.382** (0.149)	-0.436*** (0.142)	0.0203 (0.0246)
<i>p-value, Q4 x Election - Q4 x No Election</i>	0.08	0.03	0.04	0.34

## Conversely, weaker effects under debt stress ( $N_{\text{full}} = 13,544$ )

	Full Sample	Major Crops		
Q2 Extreme Heat Exposure	-0.0403 (0.0343)	-0.0768 (0.0515)	-0.151** (0.0728)	-0.0925* (0.0548)
Q3 Extreme Heat Exposure	-0.0620 (0.0514)	-0.122* (0.0683)	-0.323** (0.123)	-0.142** (0.0623)
Q4 Extreme Heat Exposure	-0.163** (0.0712)	-0.399*** (0.146)	-0.614*** (0.180)	-0.434*** (0.150)
Q2 Extreme Heat Exposure x Central Government Debt	0.0366 (0.0510)	-0.00497 (0.0739)	0.0784 (0.105)	-0.00673 (0.104)
Q3 Extreme Heat Exposure x Central Government Debt	0.110 (0.103)	0.0648 (0.101)	0.314* (0.179)	0.0646 (0.0977)
Q4 Extreme Heat Exposure x Central Government Debt	0.261** (0.129)	0.327*** (0.119)	0.675*** (0.248)	0.370** (0.147)

# Quantitative analysis

# Extreme heat effects at global scale

- How does trade policy affect global adaptation to climate shocks?
  - If policy responds to shocks in the empirically observed way

$$\text{demand} \quad \log q_{\ell k} = \log q_{\ell k}^0 - \epsilon_d \log[(1 + \alpha_{\ell k}) p_k]$$

$$\text{supply} \quad \log y_{\ell k} = \log y_{\ell k}^0 + \epsilon_s \log[(1 + \alpha_{\ell k}) p_k] - f(\text{ExtremeHeat}_{\ell k})$$

$$\text{NRA} \quad \alpha_{\ell k} = \alpha_{\ell k}^0 - g(\text{ExtremeHeat}_{\ell k}) + h(\text{ForeignExtremeHeat}_{\ell k})$$

$$\text{equilibrium} \quad Q_k(p_k^*) = Y_k(p_k^*)$$

## Scenario 1: heat waves

- Elevated ExtremeHeat<sub>lk</sub> for a group of countries
  - At the in-sample 95th percentile
  - Simulate production losses, equilibrium prices, policy responses
- Goal: quantify losses under endogenous vs. exogenous policy

$$\frac{\Delta W^{\text{endog}} - \Delta W^{\text{exog}}}{|\Delta W^{\text{endog}}|} \quad \text{for} \quad \Delta W = W^1 - W^0$$

## Important distributional consequences, but ambiguous total effects

		Shocked continent				
		Δ%	Africa	Americas	Asia	Europe
Shocked continent	W	-12	13	199	-35	
	CS	105	20	242	698	
	PS	-38	-3	-43	-14	
Rest of world	W	-64	-25	94	-22	
	CS	-52	-14	-8	-38	
	PS	50	8	32	37	

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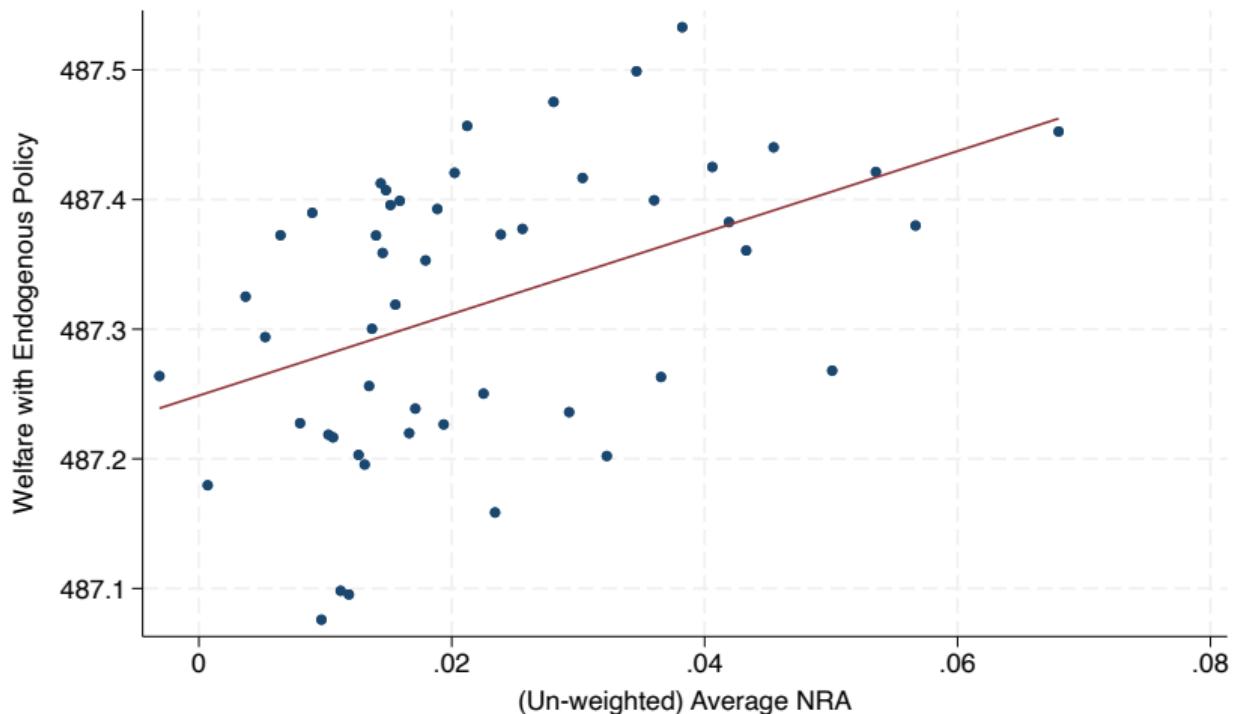
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## Random heatwaves shut down spatial correlation

		Shocked countries	
		$\Delta\%$	10 countries
		W	-3
Shocked countries	CS	225	970
	PS	-32	-28
Rest of world	W	-35	-41
	CS	-46	-46
	PS	50	49

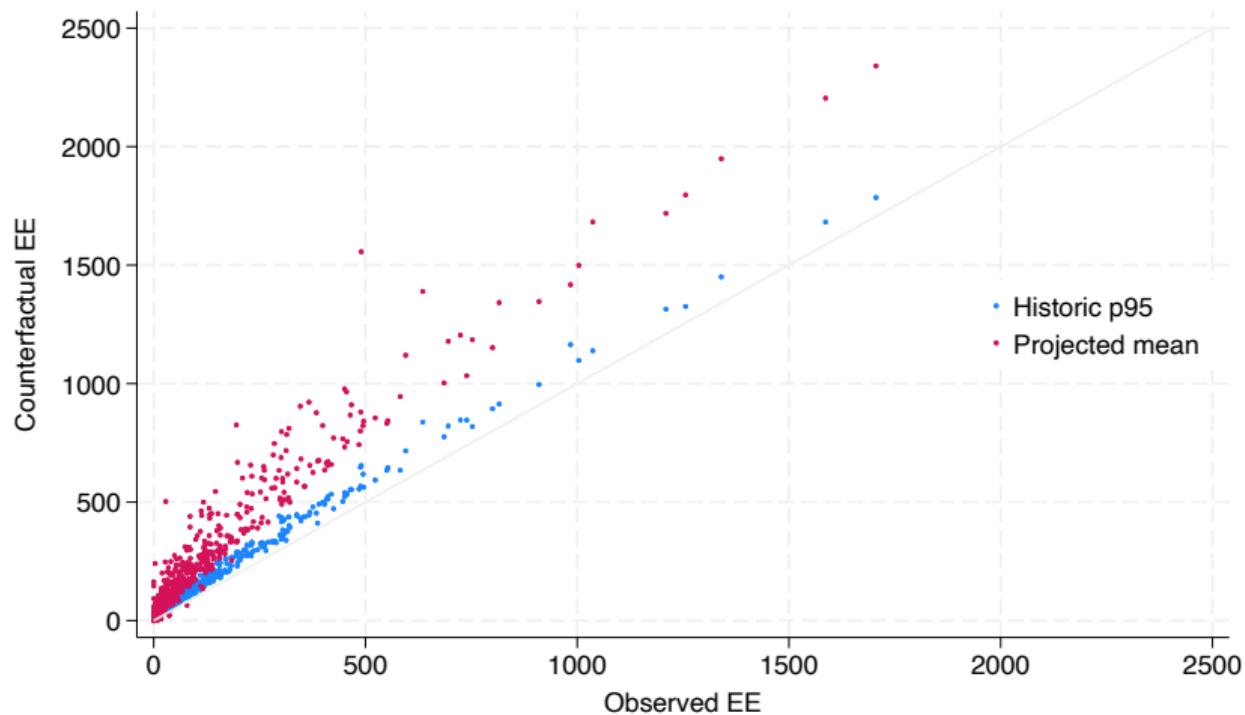
And highlight shock incidence vs. sign of existing distortions



## Scenario 2: global climate change

- Elevated ExtremeHeat<sub>lk</sub> for the world
  - Based on 2091-2100 projections (GFDL-ESM4 model)
  - Extrapolation from “weather” to “climate” shocks
- Highlight role of policy interactions
  - Given scale of shocks, geographic incidence, and spatial correlation

## More extreme than heat waves

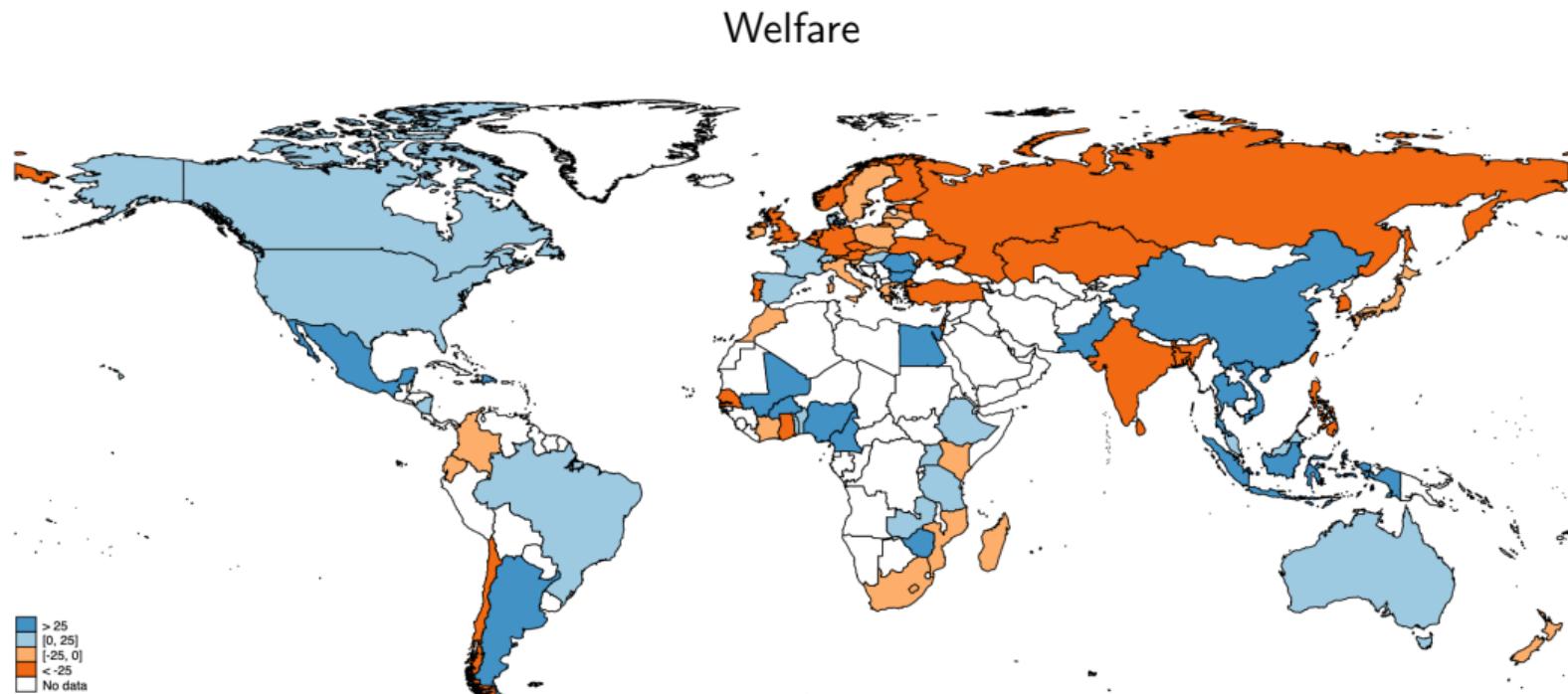


## Global welfare losses 14% bigger under endogenous trade policy

Full sample	W	CS	PS	G
Endogenous	-2.96	-1.48	-0.37	-1.11
Exogenous	-2.55	-1.72	-0.81	-0.02
Difference (%)	-14	16	123	-98

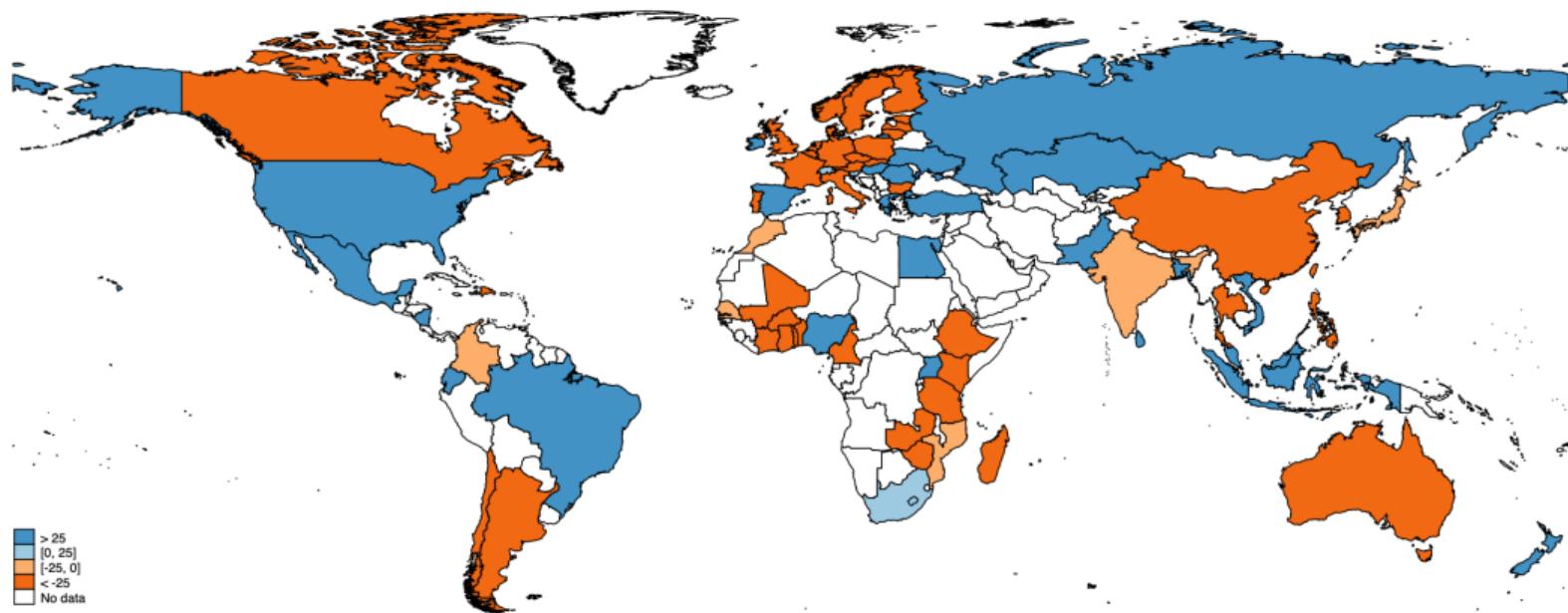
- Governments shield consumers and producers, but at great cost

# Country-level effects



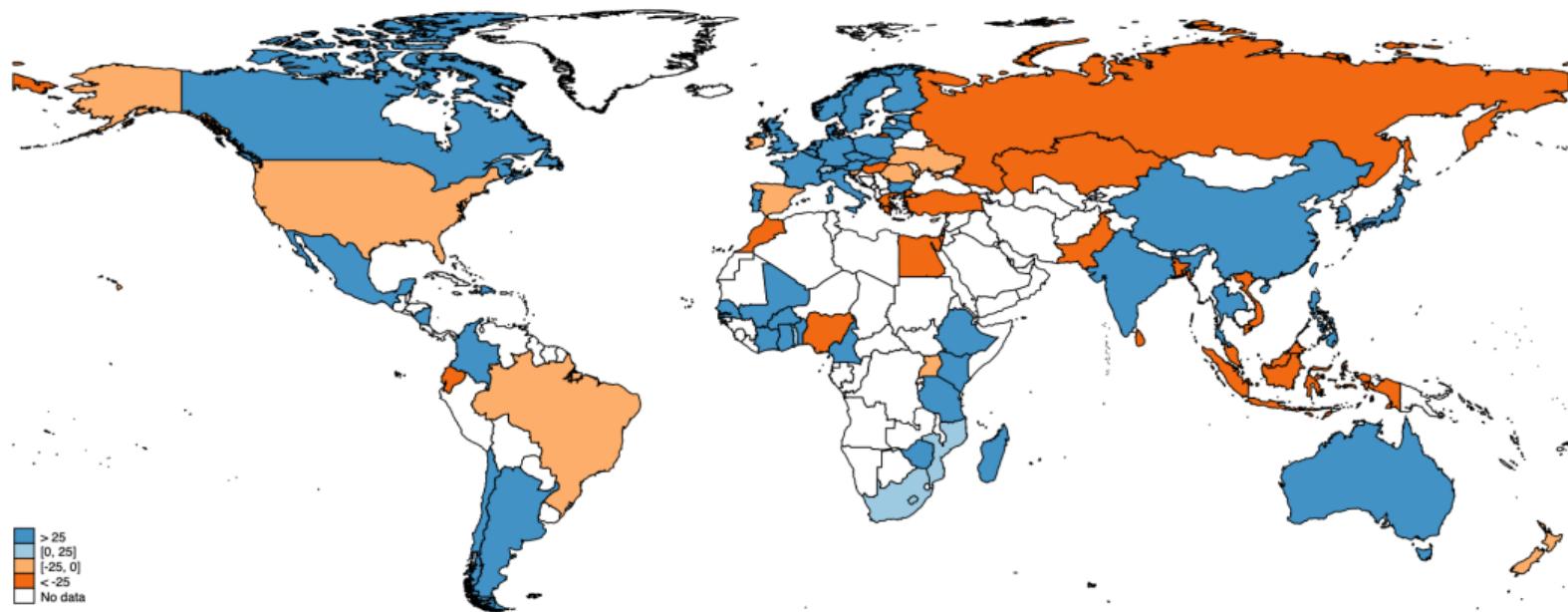
## Country-level effects

Consumer surplus



## Country-level effects

Producer surplus



## Driven by country-crops with biggest production losses

Most impacted	W	CS	PS	G
Endogenous	-2.41	0.63	-2.13	-0.92
Exogenous	-1.73	-0.64	-1.15	0.06
Difference (%)	-28	201	-46	-107

- Governments aid domestic consumers, but hurt domestic producers

## Opposite distributional effects elsewhere

Less impacted	W	CS	PS	G
Endogenous	-0.55	-2.11	1.76	-0.19
Exogenous	-0.82	-1.08	0.34	-0.08
Difference (%)	51	-49	81	-59

- Losses for foreign consumers, gains for foreign producers

## Foreign policy responses are offsetting

	W	CS	PS	G
Full sample				
With FEE response ( $\Delta\%W$ )	-14	16	123	-98
Without FEE response ( $\Delta\%W$ )	-21	0	131	-99

## Summary

- Extreme heat prompts pro-consumer trade policy
- Endogenous trade policy complicates global adaptation
  - Important distributional effects both within and across countries

# Crops

Major	Staple	Cash
maize	maize	cocoa
soy	soy	coffee
rice	rice	cotton
wheat	wheat	palm
potato	potato	sugar
tomato	tomato	tobacco
banana	onion	
cotton		
palm		
sugar		