

# Global energy demand in a warming climate

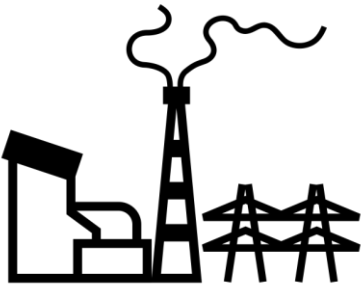
Enrica De Cian, FEEM and CMCC

**WholeSEM Annual Conference**

Session 2: Energy, Economy and Technological Transitions



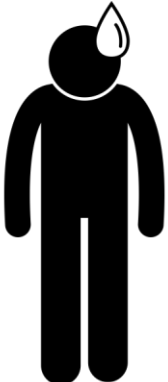
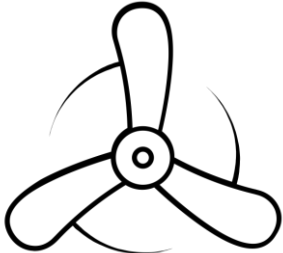
# The context



Energy



Climate Change



# The context

**Energy** connects development, adaptation, mitigation

Adaptation-driven energy use as a **key driver** of future energy scenarios

**Hinder progress** towards SD and decarbonization?

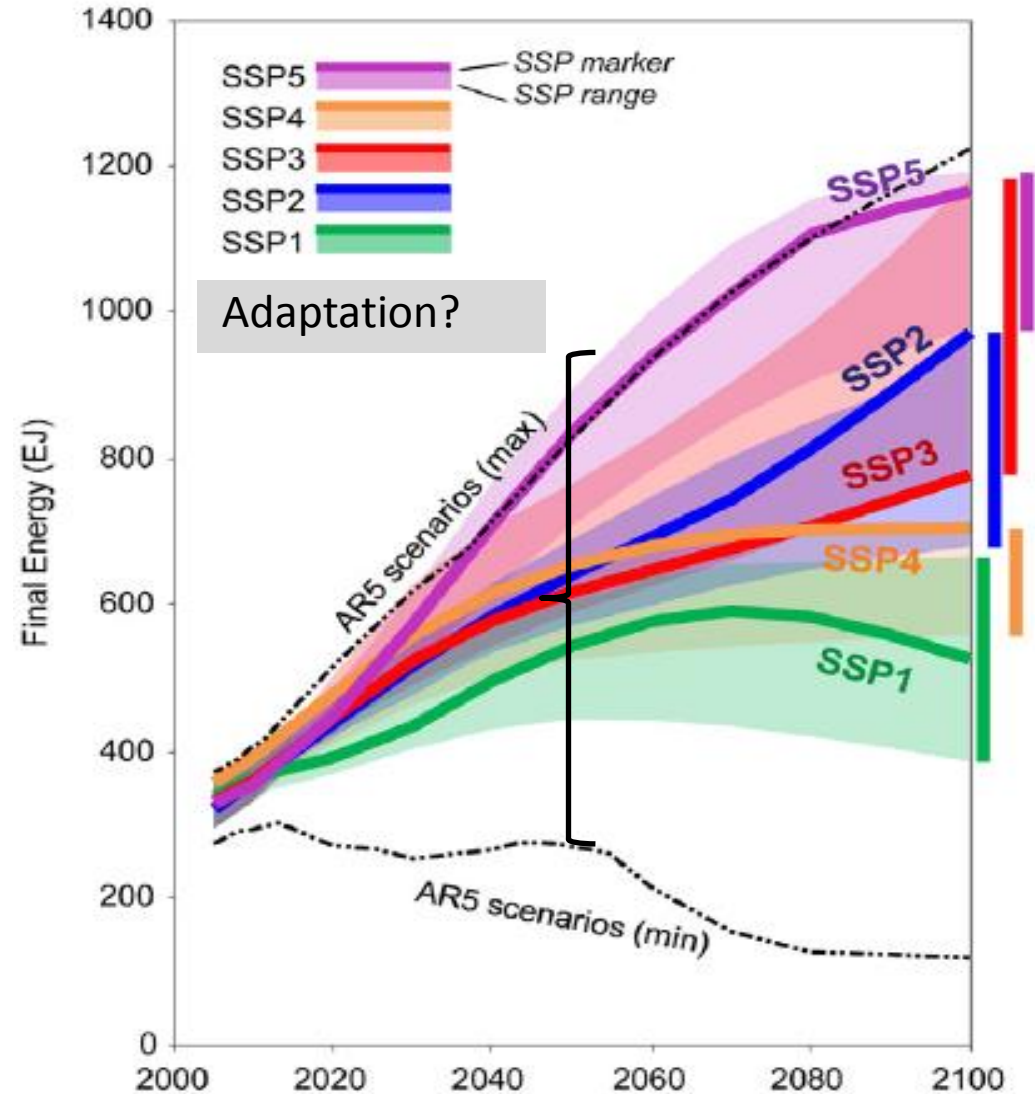
## SUSTAINABLE DEVELOPMENT GOALS



# Gaps in the transformation pathways lit.

Existing energy scenarios (BAU & mitigation) **do not include the feedback of climate change on energy demand via adaptation** (Fisher-Vanden et al. 2014, Riahi et al. 2017)

A major gap that could affect **transition dynamics** of decarbonization pathways (IPCC 5AR WGIII, e.g. Ch 6)



# Gaps in the effort-sharing lit.

## Article 2

1. This Agreement, in enhancing the implementation of the Convention, including its objective, aims to strengthen the global response to the threat of climate change, in the context of sustainable development and efforts to eradicate poverty, including by:

(a) Holding the increase in the global average temperature to well below 2°C above pre-industrial levels and pursuing efforts to limit the temperature increase to 1.5°C above pre-industrial levels, recognizing that this would significantly reduce the risks and impacts of climate change;

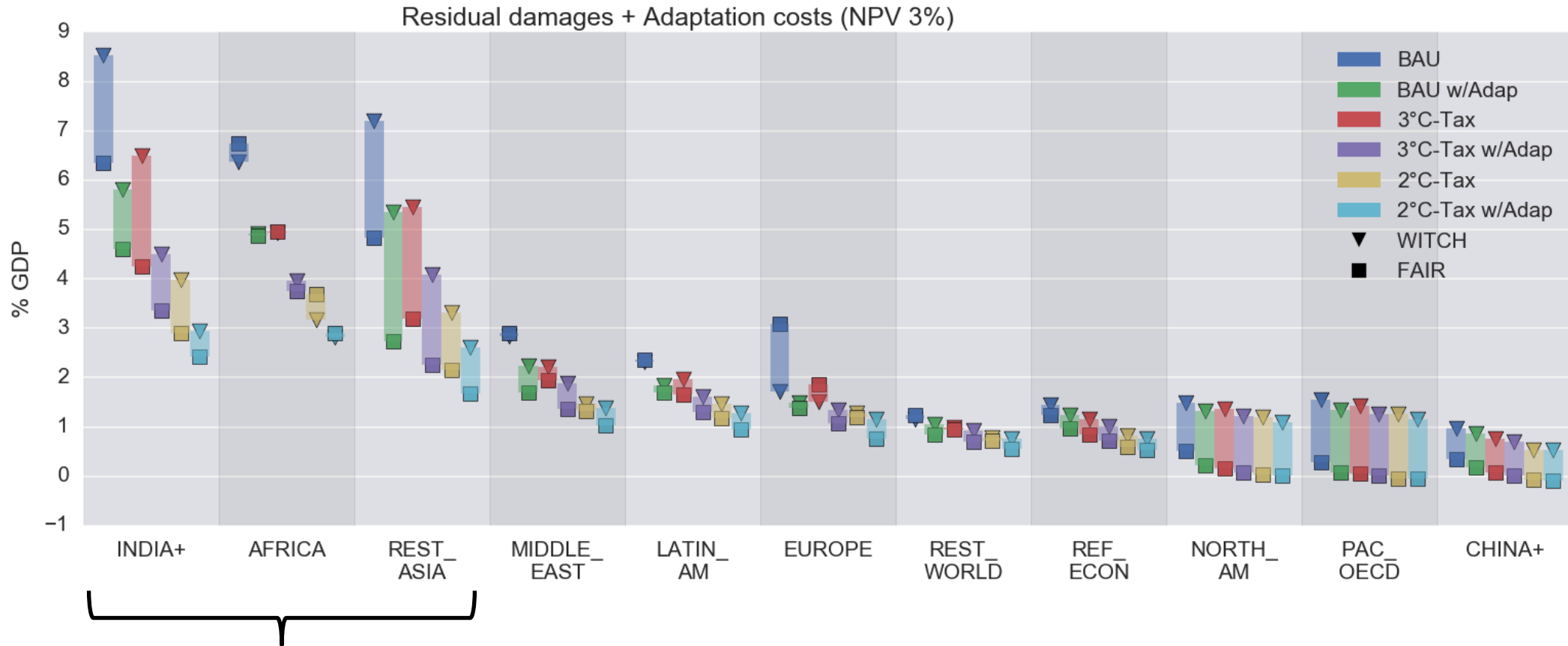
(b) **Increasing the ability to adapt** to the adverse impacts of climate change and foster climate resilience and low greenhouse gas emissions development, in a manner that does not threaten food production; and

(c) Making finance flows consistent with a pathway towards low greenhouse gas emissions and climate-resilient development.

2. **This Agreement will be implemented to reflect equity** and the principle of common but differentiated responsibilities and respective capabilities, in the light of different national circumstances.

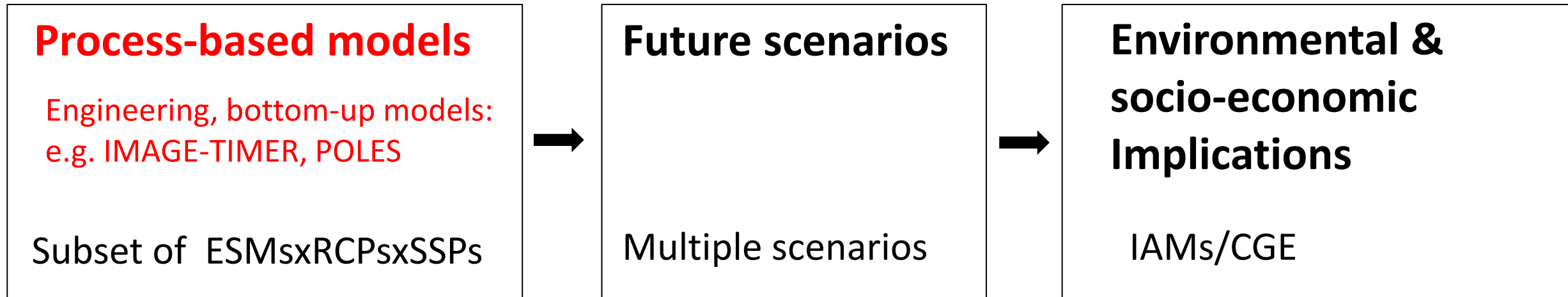


# Gaps in the effort-sharing lit.



+\$500 billion in 2050 to **high impact countries** to equalize total climate costs (mitigation + damages + adaptation costs), De Cian et al. 2016, ERL

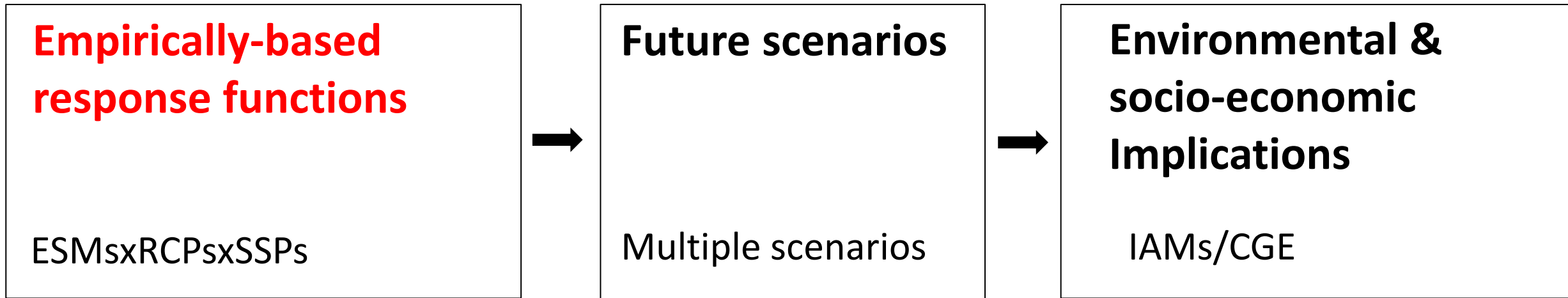
# Impact literature: the common framework



**Examples:** Isaac and van Vuuren 2009, Bosello et al. 2012, Dowling 2013, Hasegawa et al. 2016

**Issues:** expensive in terms of data and time requirements

# Impact literature: a more flexible framework



**Examples:** Eboli et al. 2009, Roson and der Mensbrugghe (2010)

**Issues:** reduced-form response functions



# Empirically-based response functions

Identify a **reduced-form relationship**  $F()$  while controlling for confounding factors ( $\mathbf{Z}$ )

$$q_{i,t} = \mu_i + \tau_t + F[T_{i,t}, H_{i,t}] + \mathbf{Z}_{i,t}\boldsymbol{\gamma} + \varepsilon_{i,t}$$

$i, t$  : observational units (e.g. country) and time over some historical period

Control for:

- time-invariant heterogeneity ( $\mu_i$ )
- unspecified exogenous influences affecting all units ( $\tau_t$ )
- confounding factors ( $\mathbf{Z}_{i,t}$ ) – GDP, prices

**Example:** De Cian, Sue Wing, In prep

# Empirical strategy (De Cian, Sue Wing, In prep.)

- Choose E to achieve a target of thermal performance
- Divergence between desired thermal performance and actual energy use
- Adjust E to min costs of adjustments + costs of not attaining the target

$$\begin{aligned}
 \Delta q_{i,t} = & \alpha_i + \underbrace{\left[ \sum_{j=1}^J \beta_j^T \Delta \varepsilon_{j,i,t}^T + \sum_{k=1}^K \beta_k^H \Delta \varepsilon_{k,i,t}^H + \sum_f \beta_f^P \Delta p_{f,i,t} + \beta^Y \Delta y_{i,t} + \beta^X \Delta x_{i,t} \right]}_{\text{Short-run}} \\
 & + \theta \left\{ \underbrace{q_{i,t-1} - \sum_{j=1}^J \gamma_j^T \varepsilon_{j,i,t-1}^T - \sum_{k=1}^K \gamma_k^H \varepsilon_{k,i,t-1}^H - \sum_f \gamma_f^P p_{f,i,t-1} - \gamma^Y y_{i,t-1} - \gamma^X x_{i,t-1}}_{\text{Long-run}} \right\} + \nu_{i,t}
 \end{aligned}$$

# Future scenarios (De Cian, Sue Wing, In prep.)

- Change in exposure to the same **hot/cold days** used in the regressions from GCM temperature projections (RCPs 4.5 & 8.5) for each grid cell, **c**, fuel, **f**, sector, **s**:

$$\phi_{c,f,s}^{\text{Climate}} = \exp \left\{ \underbrace{\sum_{j=1}^J \hat{\gamma}_{j,f,s}^T}_{\text{Estimated semi-elasticities to hot/cold days}} \left( \underbrace{\tilde{\varepsilon}_{j,c,\text{Future}}^T - \tilde{\varepsilon}_{j,c,\text{Current}}^T}_{\text{Change in 2050 exposure to hot/cold days}} \right) \right\}$$

Estimated semi-elasticities to hot/cold days

Change in 2050 exposure to hot/cold days

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Estimated semi-elasticities to hot/cold days

Change in 2050 exposure to hot/cold days

- Change in per capita income (SSPs)

$$\phi_{i,f,s}^{\text{Economy}} = \exp \left\{ \underbrace{\hat{\gamma}_{f,s}^Y}_{\text{Estimated per capita income elasticities}} \left( \underbrace{\tilde{y}_{i,\text{Future}} - \tilde{y}_{i,\text{Current}}}_{\text{Change in 2050 exposure to hot/cold days}} \right) \right\}$$

Estimated per capita income elasticities

Change in 2050 exposure to hot/cold days

# Data for the empirical analysis

- Unbalanced panel of tropical and temperate countries (1970-2014)
- 5 sectors: agr, com, ind, res, tra
- 3 fuels: electricity, natural gas, petr. prd
- 4 specifications leading to  $5 \times 3 \times 2 \times 4 = 120$  estimated equations
- Data sources: ENERDATA, PWT, GLDAS, GRUMPv1

	Elec- tricity	Natural Gas	Petrol- eum	<i>Total</i>	Elec- tricity	Natural Gas	Petrol- eum	<i>Total</i>
	Tropical				Temperate			
Agriculture	0.8	0	1.5	2.3	0.9	0.3	3.2	4.4
<u>Industrial</u>	4.5	6.8	4.6	15.9	21.6	12.9	8	42.5
Residential	3.5	2	3	8.5	14	15.9	5.4	35.3
Commercial	2.6	0.3	0.7	3.6	14.1	7.4	3.2	24.7
<u>Transportation</u>	0.1	0.6	19.4	20.1	0.8	0.6	60	61.4
<i>Total</i>	11.5	9.7	29.2	<b>50.4</b>	51.4	37.1	79.8	<b>168.3</b>

# Empirical results

- High heterogeneity
- Positive temperature semi-elast. to hot days
- Some negative temperature semi-elast. to cold days in tropical regions
- LR responses are larger than SR

			Response to cold days ( $T < 12.5^{\circ}\text{C}$ )	Response to hot days ( $T > 27.5^{\circ}\text{C}$ )	Log real GDP per capita elasticity
Temperate regions					
Agriculture	Electricity	M4		0.008	0.645
	Natural gas	M1	-0.0195 <sup>+</sup>		1.320
	Petroleum				
Industrial	Electricity	M2		0.009	0.363
	Natural gas	M2		0.033	
	Petroleum	M2			-1.089
Residential	Electricity	M3		0.0146 <sup>+</sup>	0.366
	Natural gas	M1	0.023		1.433
	Petroleum	M4	0.0207 <sup>+</sup>		
Commercial	Electricity	M1	-0.006	0.047	0.864
	Natural gas	M1			0.970
	Petroleum	M3	0.012		-0.795
Transportation	Electricity	M1	-0.003 <sup>+</sup>		0.260
	Natural gas				
	Petroleum	M1			0.821
Tropical regions					
Agriculture	Electricity	M1	-0.008 <sup>+</sup>		-0.701
	Natural gas				
	Petroleum	M1	0.066		
Industrial	Electricity	M1	-0.028	0.008 <sup>+</sup>	0.478
	Natural gas	M2		0.010	
	Petroleum	M2		0.005	
Residential	Electricity	M2			1.287
	Natural gas				
	Petroleum				
Commercial	Electricity	M1		0.008	0.702
	Natural gas	M1			
	Petroleum	M3	-0.014	-0.017	
Transportation	Electricity	M3		-0.011	1.93
	Natural gas				
	Petroleum	M1	-0.009	0.004 <sup>+</sup>	0.678

# Future scenarios: exposure

Illustrative – SSP5+RCP4.5 and RCP8.5, 1 GCM (CMCC-CM)

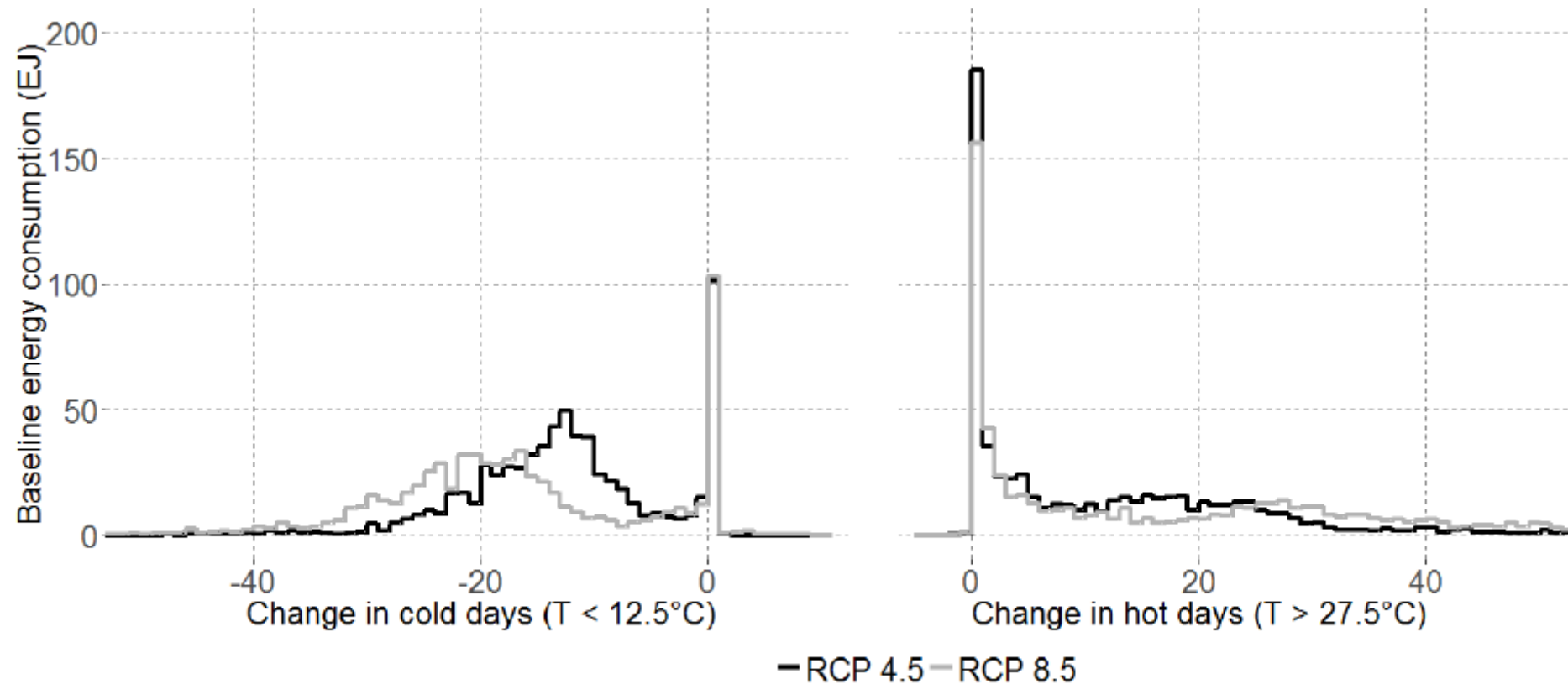
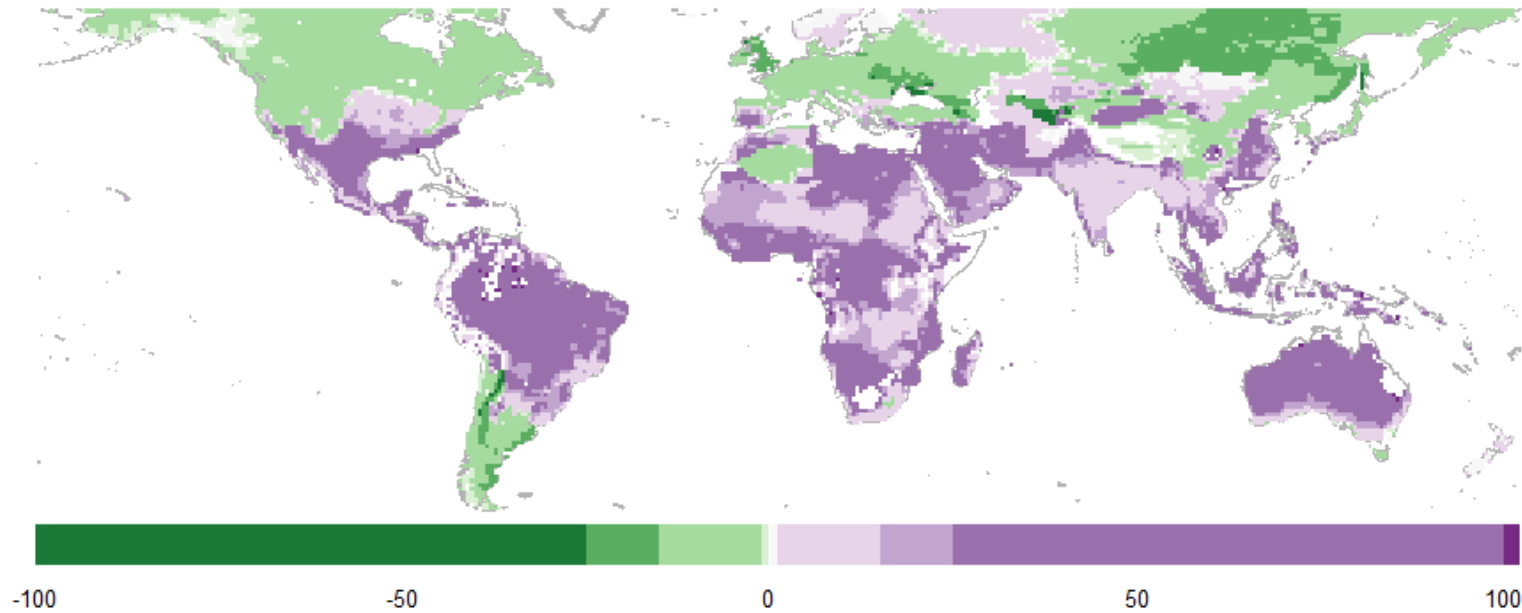


Figure 3: Exposure of business as usual energy demand to temperature changes

# Future scenarios: impacts

2050 % Change Final Energy, Total. RCP8.5



Note: Spatial variation is driven by variation in EXPOSURE  
SSP5, RCP4.5, RCP8.5, CMCC-CM GCM

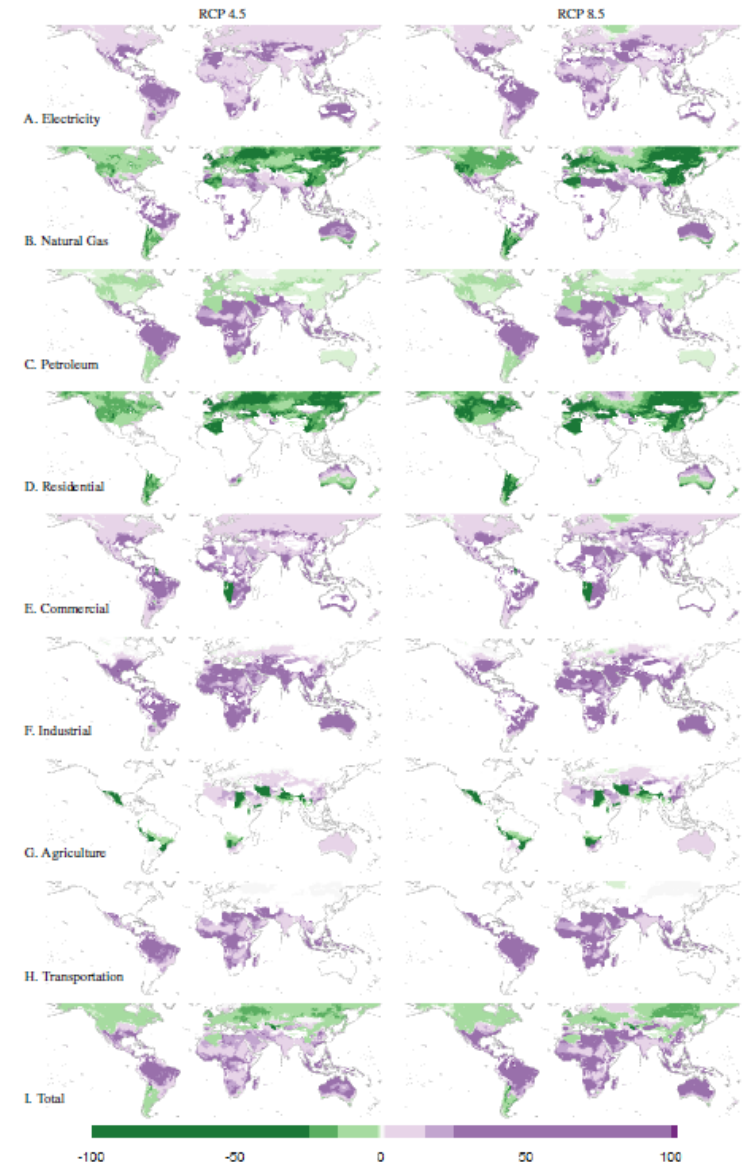


Figure 4: CMCC-CM simulated impacts on final energy demand circa 2050



# Future scenarios: incidence

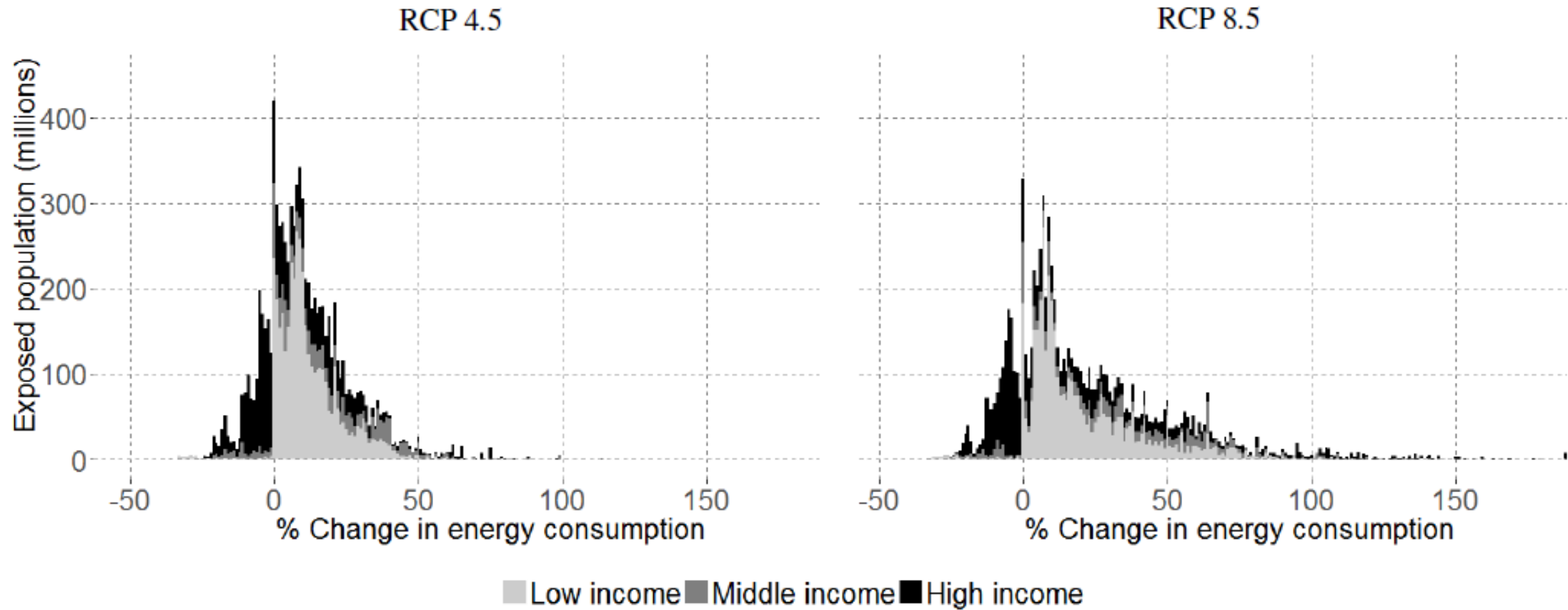
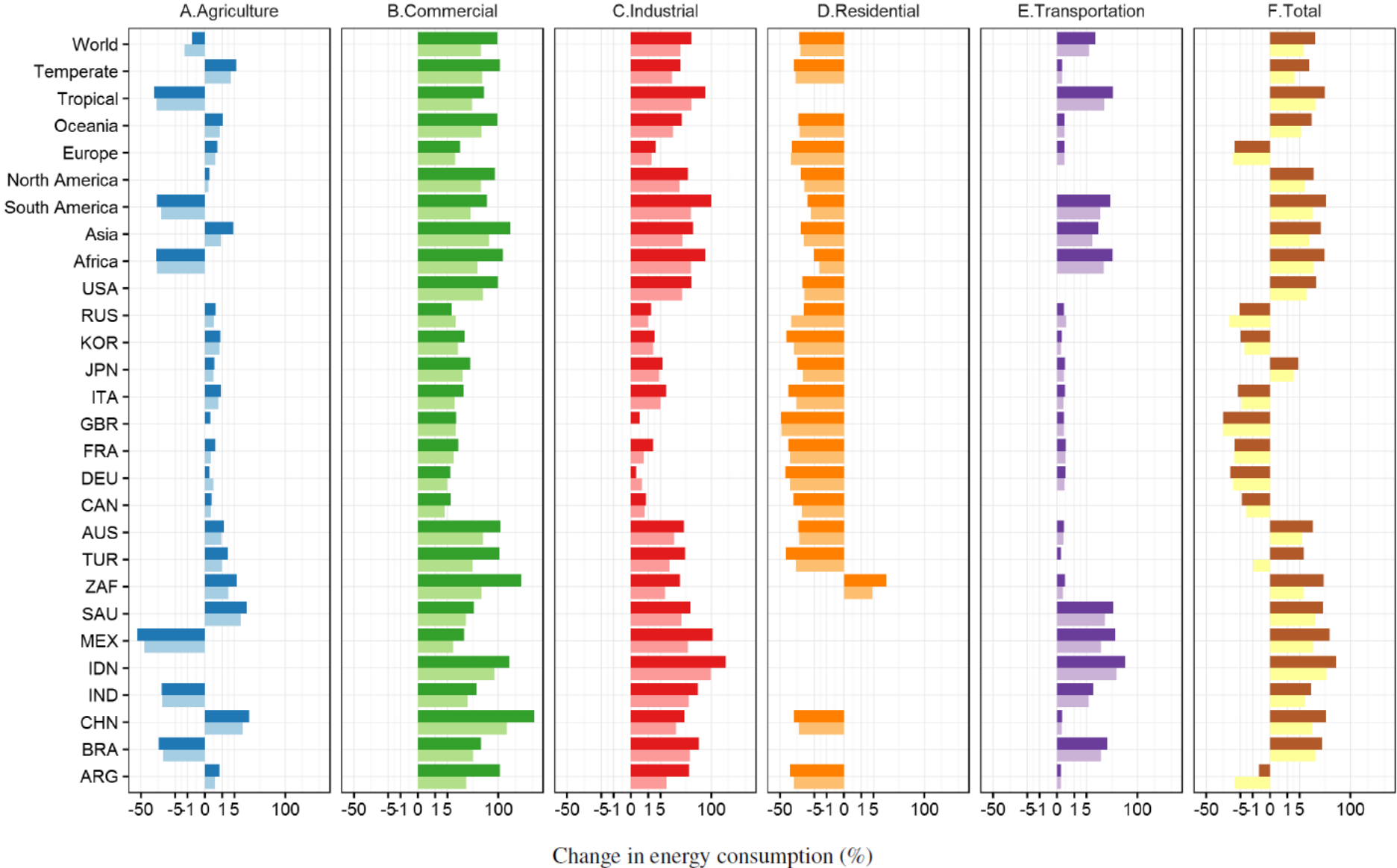


Figure 5: Incidence of climate change impacts on energy demand relative to future baseline

# Future scenarios: aggregate results



# Gaps & future research

- **Empirical evidence:** improved, but still poor socio-economic and geographic heterogeneity
- **Future scenarios:** explore uncertainty in the new scenario framework (Riahi et al. 2017)
- **Implications:** on the economy, environment, but also distributional impacts (e.g. on poverty)
- A new **MIP**?

**Thank you for your attention**  
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# Future scenarios (De Cian, Sue Wing, In prep.)

- Change in exposure to **hot/cold days** (RCPs) using **delta method**
- Change in per capita income (SSPs)

$$\phi_{c,f,s}^{\text{Climate}} = \exp \left\{ \sum_{j=1}^J \widehat{\gamma}_{j,f,s}^T (\tilde{\varepsilon}_{j,c,\text{Future}}^T - \tilde{\varepsilon}_{j,c,\text{Current}}^T) \right\}$$

$$\Phi_{i,\text{Future}} = \frac{\sum_f \sum_s \left\{ \sum_{c \in i} \bar{w}_{c,i,\text{Future}} \phi_{c,f,s}^{\text{Climate}} \right\} \tilde{Q}_{i,f,s,\text{BaU}}}{\sum_f \sum_s \tilde{Q}_{i,f,s,\text{BaU}}}$$

Future energy demand  
@ country  $i$ , fuel  $f$ , sector  $s$

$$Q_{i,f,s,\text{BaU}} = \phi_{i,f,s}^{\text{Economy}} \tilde{Q}_{i,f,s,\text{Current}}$$

$$\phi_{i,f,s}^{\text{Economy}} = \exp \left\{ \widehat{\gamma}_{f,s}^Y (\tilde{y}_{i,\text{Future}} - \tilde{y}_{i,\text{Current}}) \right\}$$