

Just Transition, Mitigation and Climate Impacts and socioeconomic implications

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1. Welfare and Well-being
2. Employment and the Energy Sector
3. Equity and distributional outcomes
4. Climate Impacts and Integration
5. Distributional Impacts
6. Open source IAMs, development, and exploitation



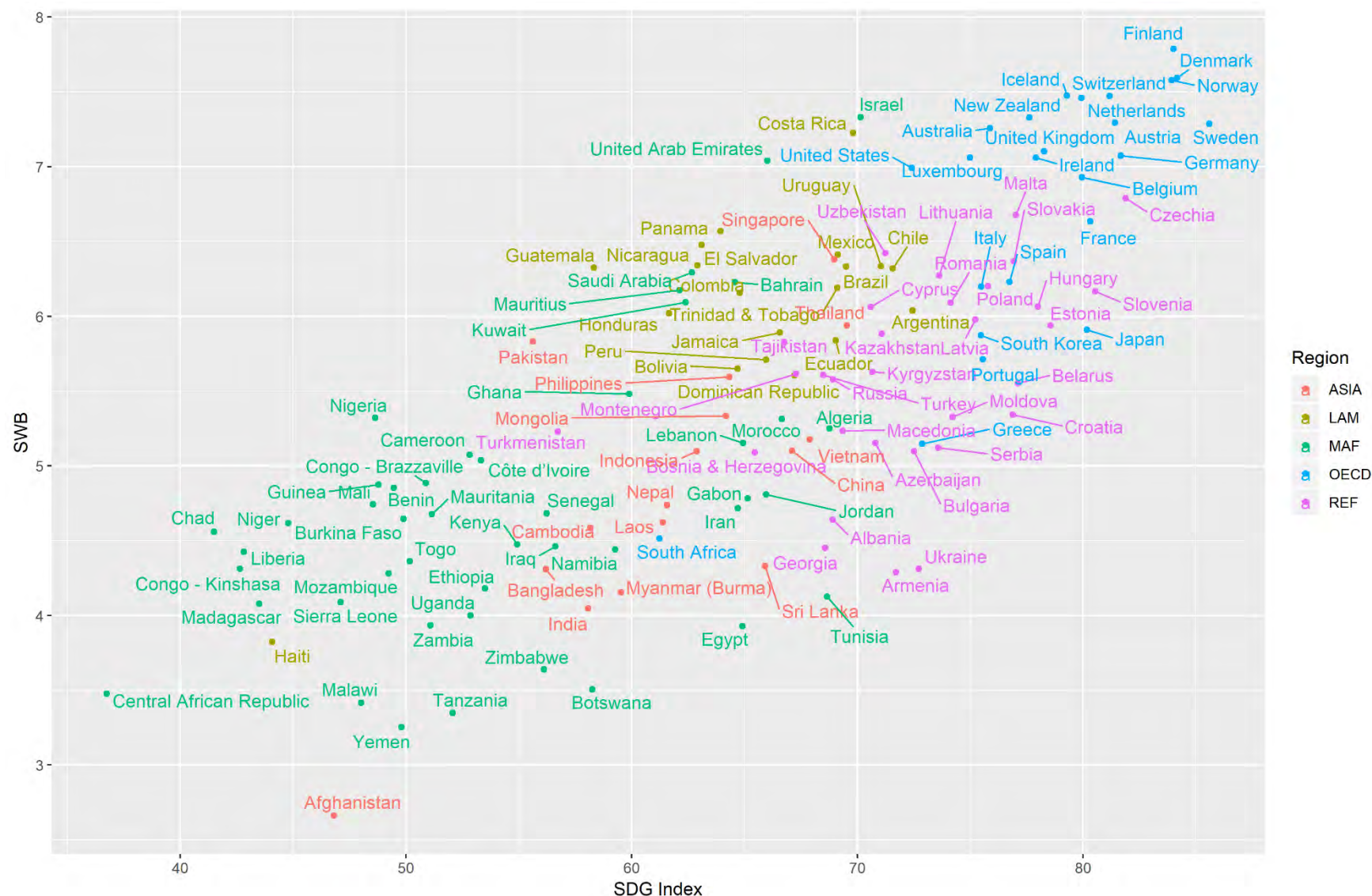
*Between the best and worst possible life,
how would you rank how you feel
personally about your life at this point?

on a scale from 0 to 10.*

Well-being and Welfare



Well-being – macro and micro



R(Pearson) = 0.77

SDSN (2018): SDG Index and Dashboards Report 2018. Global responsibilities. Implementing the Goals. Bertelsmann Stiftung and Sustainable Development Solution Network.



Related literature

- Barrington-Leigh and Galbraith (2019, NatComms)
- Rehdanz and Maddison (2005, EcolEcon): one year of data, multivariate country analysis
- Bjørnskov et al. (2007) explore multivariate macro factors on individual WVS data
- Easterlin et al. (2010) updates the Easterlin paradox
- Welsch (2003), Ferreira et al. (2013), and Zhang et al. (2017) find negative impact of air pollution
- Mazur (2011) examines impact of energy/electricity consumption
- Other dimensions
 - Life expectation
 - Education, Urbanisation (SSP dimension)
 - Biodiversity/Forest/recreational value



3. Determinants and Categories

Dimension	Variable	Source	References	Hypothesis	Unit
Economy	Income or GDP	IMF-WEO	(Mikucka et al., 2017)	+	[\$2005, MER]
Economy	Rate of economic growth	IMF-WEO	(Easterlin et al., 2010)	+ / (0)	%
Economy	Unemployment	WDI	(Di Tella et al., 2001)	-	%
Economy	Inflation	WDI	(Di Tella et al., 2001)	-	%
Environment	Air pollutant emissions (Mt/year)	CEDS	for AQI, SO ₂ , NO ₂ , PM ₁₀	-	Emissions/land area
Environment	SO ₂ mean annual concentration (µg/m ³)	EDGAR/CEDS	(Zhang et al., 2017) (Ferreira et al., 2013)	-	Emissions/land area
Environment	NO ₂ , lead	EDGAR/CEDS	(Zhang et al., 2017) (Welsch, 2003)	-	Emissions/land area
Environment	Natural capital / Forest area	World Bank, WDI	(Engelbrecht, 2009)	+	%
Energy	Energy consumption	IEA	(Mazur, 2011)	+	Per capita energy and electricity consumption
Energy	Electricity consumption	IEA	(Mazur, 2011)	+	Per capita energy and electricity consumption
Socio-demography	Share of population living in urban areas	WDI, SSP	(Sørensen, 2014) (Li and Kanazawa, 2016)	-	% of population
Socio-demography	Population density	WDI, SSP	(Sørensen, 2014) (Li and Kanazawa, 2016)	-	1000 inhabitants / km ²
Socio-demography	Number of young/old	Wittgenstein Centre	(Di Tella et al., 2001)	(+) / -	years
Socio-demography	Education	Wittgenstein Centre	(Elgar et al., 2011)	+ (-)	Years, share of secondary and tertiary education
Socio-demography	Literacy rate	WDI	(Cornali, 2011)	+	%
Socio-demography	Life expectancy (years)	WDI		+	years
Socio-demography	Relative income, Gini	WDI, IMF-WEO	(Di Tella et al., 2001)	-	Index, or relative income
Institutions	Government Effectiveness	WBI	(Bjørnskov et al., 2010)	+	
Institutions	Index of democracy	Polity IV	(Bjørnskov et al., 2010)	+	



Well-being – macro and micro

	OLS			linear mixed-effects	
	(1)	(2)	(3)	(4)	(5)
lgdppc	0.18*** (0.05)	0.22*** (0.05)	0.53*** (0.20)	0.18*** (0.05)	0.39*** (0.11)
energy_enduse	0.0000** (0.0000)	0.0000 (0.0000)	0.0003*** (0.0001)	0.0000** (0.0000)	0.0001* (0.0000)
inflation	0.002 (0.002)	0.003 (0.003)	−0.004*** (0.002)	0.003 (0.002)	−0.003** (0.002)
educgrownups23	0.28 (0.18)	0.38** (0.19)	−1.00*** (0.32)	0.21 (0.18)	−0.87*** (0.27)
gini_swiid	−2.15*** (0.35)	0.29 (0.32)	−1.02 (1.25)	−2.13*** (0.35)	−0.26 (0.80)
government_effectiveness	0.37*** (0.05)	0.17*** (0.05)	0.42*** (0.08)	0.38*** (0.05)	0.34*** (0.07)
urbanisation	−0.002 (0.002)	0.01*** (0.002)	−0.02* (0.01)	−0.001 (0.002)	0.003 (0.005)
life_expectancy	0.01** (0.01)	0.05*** (0.004)	−0.03** (0.01)	0.01* (0.005)	0.003 (0.01)
calories	0.0003*** (0.0001)	0.0000 (0.0001)	0.0003 (0.0002)	0.0002*** (0.0001)	0.0001 (0.0002)
population_density	−0.30*** (0.10)	−0.57*** (0.10)	−2.35* (1.32)	−0.35*** (0.10)	−0.60** (0.25)
CO	−0.004 (0.003)	0.001 (0.003)	0.0003 (0.003)	−0.001 (0.003)	0.001 (0.003)
electricity	0.06*** (0.02)	0.10*** (0.03)	−0.15 (0.12)	0.06*** (0.02)	−0.004 (0.07)
unemployment	−0.02*** (0.004)	−0.04*** (0.004)	−0.03*** (0.01)	−0.02*** (0.004)	−0.04*** (0.01)
education_years	0.04** (0.02)	−0.02 (0.02)	0.10* (0.06)	0.04** (0.02)	0.05 (0.04)
temperature_mean	0.01 (0.01)	0.04*** (0.01)	0.23* (0.14)	0.005 (0.01)	0.03 (0.02)
temperature_max	−0.005 (0.01)	−0.05*** (0.01)	0.02 (0.08)	−0.002 (0.01)	−0.02 (0.03)
precipitation_mean	−0.003*** (0.001)	−0.005*** (0.001)	−0.003 (0.01)	−0.003*** (0.001)	−0.002 (0.002)
precipitation_max	0.002*** (0.001)	0.003*** (0.001)	0.001 (0.002)	0.002*** (0.001)	0.001 (0.001)
I(year - 2015)	−0.01** (0.01)	−0.02*** (0.01)	0.01 (0.01)		
REGIONr5asia	2.91*** (0.45)				
REGIONr5lam	3.75*** (0.46)				
REGIONr5maf	2.60*** (0.41)				
REGIONr5oecd	2.69*** (0.44)				
REGIONr5ref	2.27*** (0.43)				
Constant		0.04 (0.39)	0.60 (2.89)	3.03*** (0.49)	2.22** (0.95)
Country	No	No	FE	No	RE
Region	FE	No	No	RE	No
Year	Trend	Trend	Trend	RE	RE
Observations	1,078	1,078	1,078	1,078	1,078
R ²	0.99	0.76	0.94		
Adjusted R ²	0.99	0.75	0.93		
Log Likelihood				−904.13	−497.84
Akaike Inf. Crit.				1,852.26	1,039.69
Bayesian Inf. Crit.				1,961.88	1,149.31

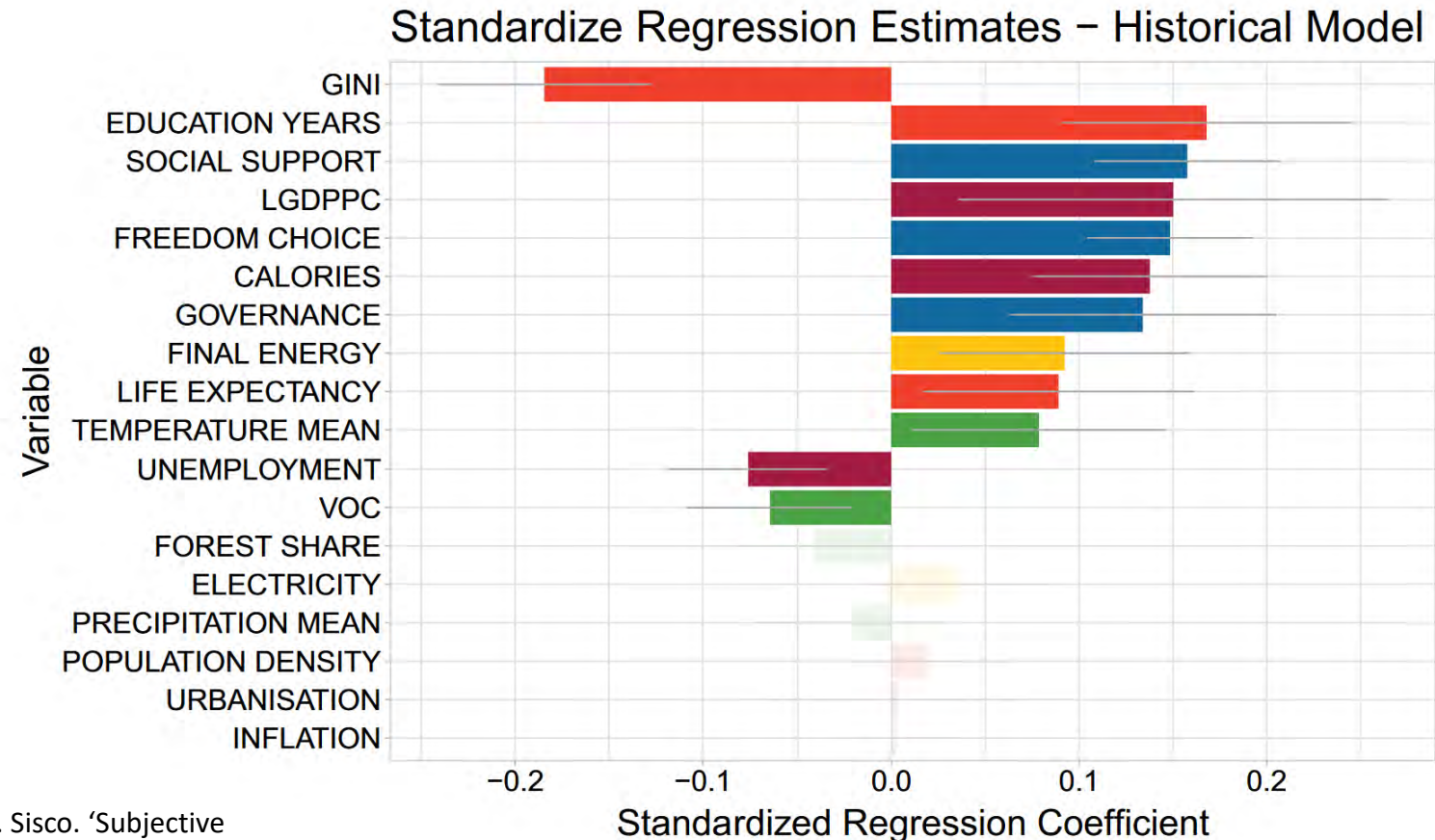
Note:

*p<0.1; **p<0.05; ***p<0.01

Individual level
Variance Decomposition:
77% idiosyncratic
18% explained Macro
5% unexplained Macro



- How to evaluate pathways in terms of well-being?
- Subjective well-being (SWB [0-10])
- Inequality and Unemployment biggest negative determinants

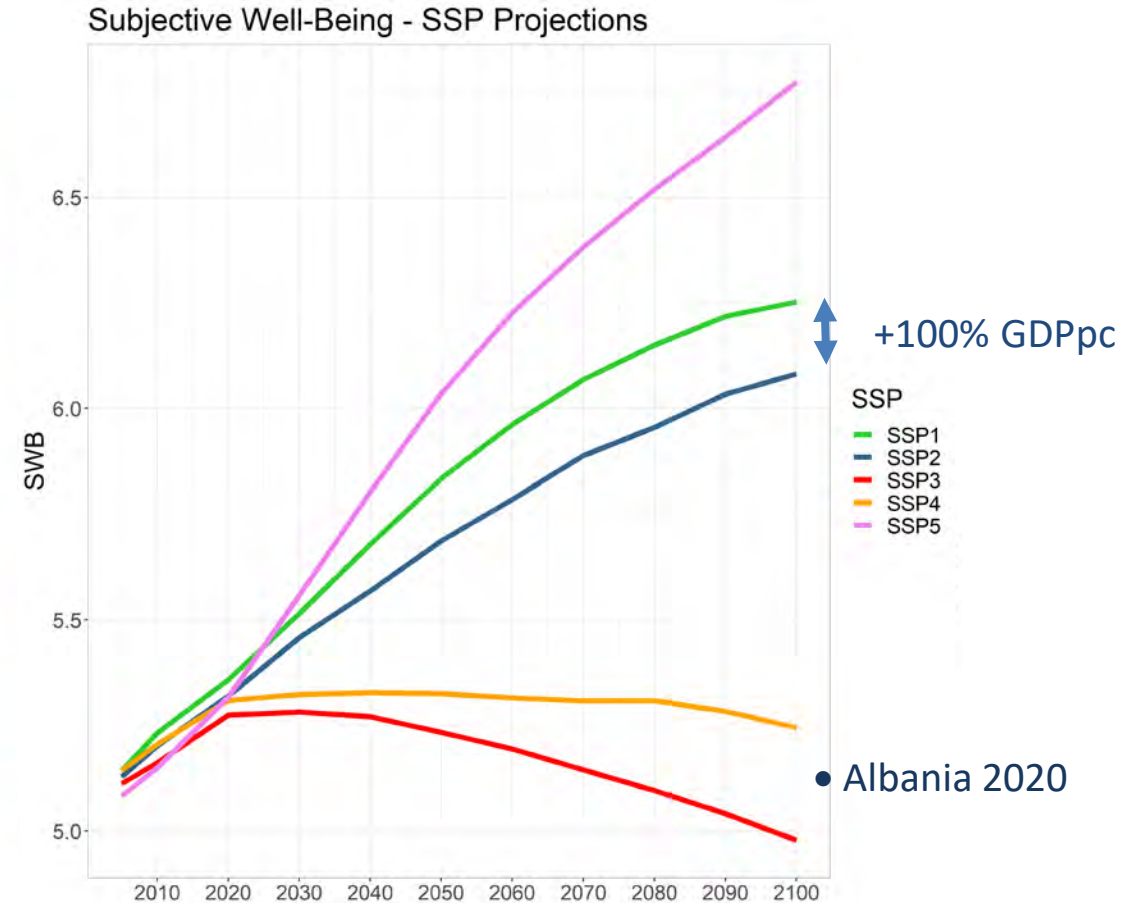
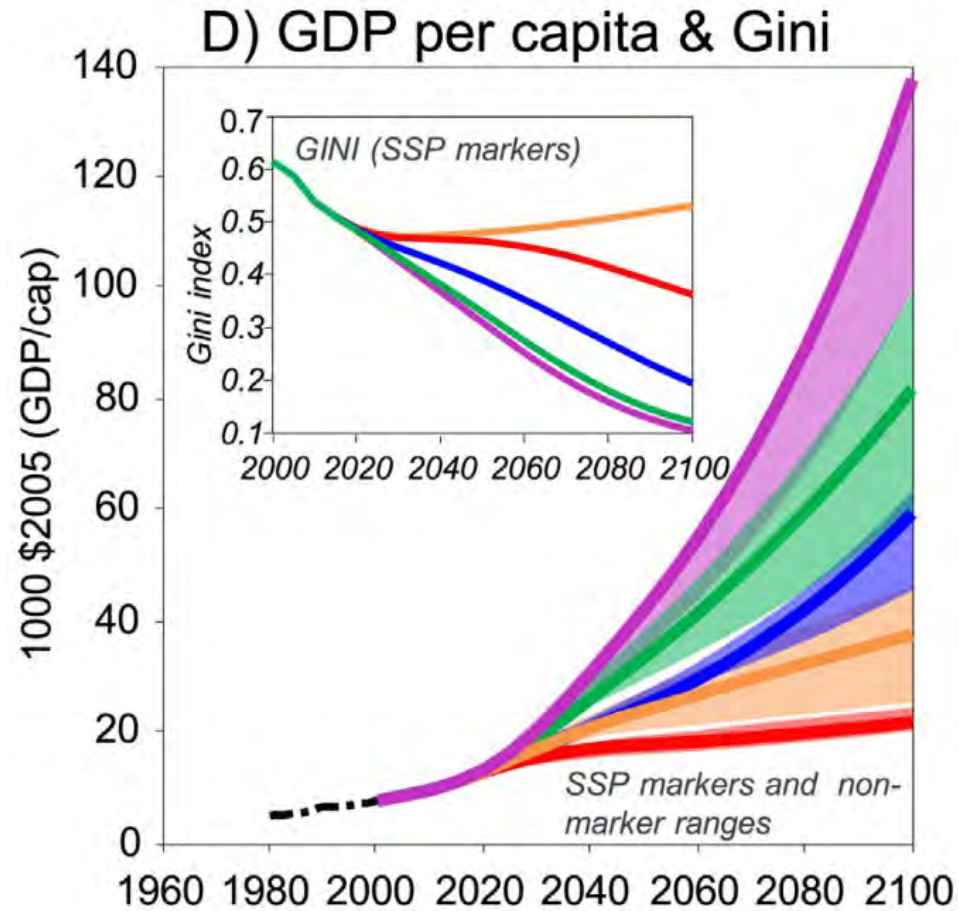


Source: Emmerling, Johannes, Paula Navarro, and Matthew R. Sisco. 'Subjective Well-Being at the Macro Level—Empirics and Future Scenarios'. Social Indicators Research, 157, pages899–928 (2021). <https://doi.org/10.1007/s11205-021-02670-2>

■ Economy ■ Energy ■ Environment ■ Institutions ■ Sociodemography



• Finland 2020



Future fork: application to sub-national and regional level (WVS, ...)



- Climate policies will face political & social resistance in the absence of just transition plans
- From a justice point of view it's important to think about workers livelihoods
- Just transition endorsed by
 - ILO
 - UNFCCC
 - COP24



Just transition – energy jobs



What will happen to the livelihood of millions of coal & other fossil fuel workers?

أرامكو السعودية
Saudi Aramco



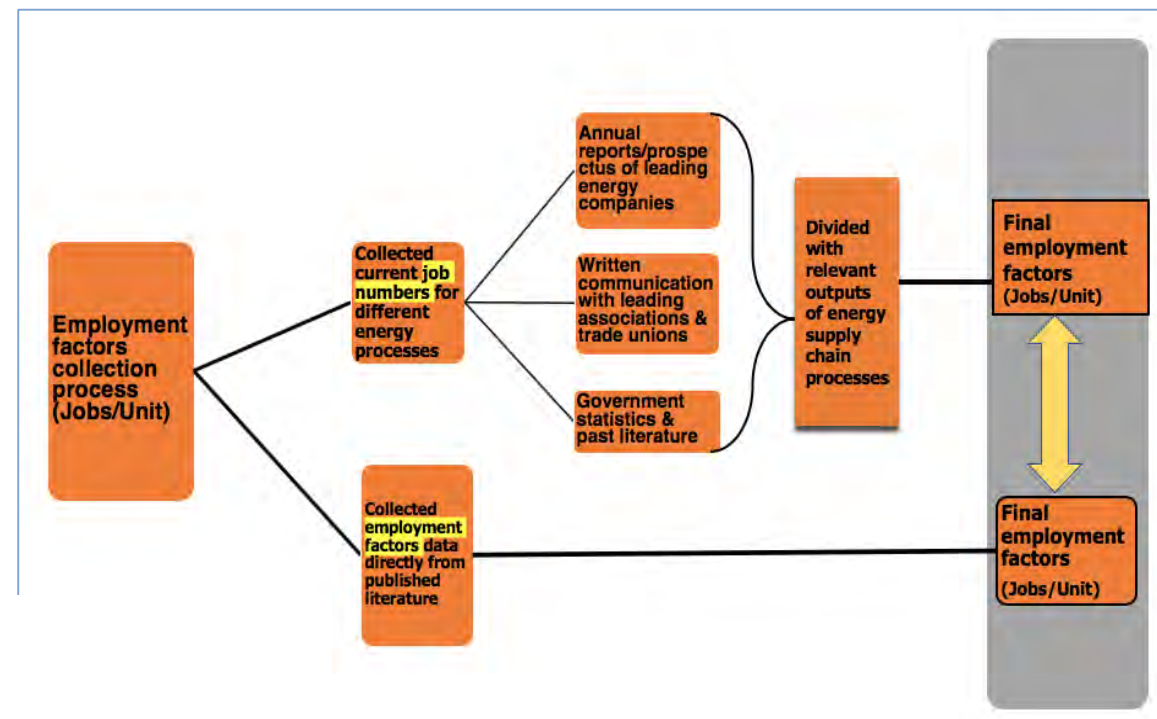
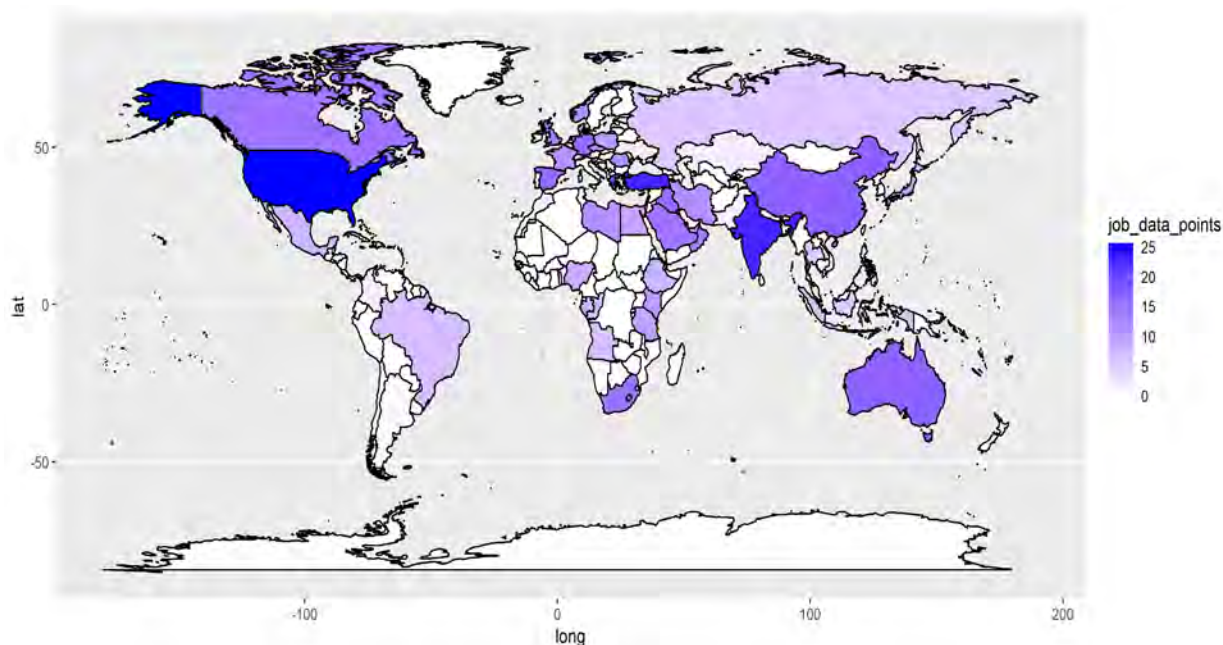
50+ country dataset

- Annual reports
 - Big oil companies
 - Saudi Aramco (Saudi Arabia), Gazprom (Russia), Sinopec (China), and Pemex (Mexico),
 - Big coal companies
 - Coal India (India), SUEK Ltd (Russia)
- Written communications
 - World Nuclear Associations
 - Trade unions like the Federation of Oil Unions (Iraq), Central de los Trabajadores y Trabajadoras (Brazil)
- Official statistics from countries
- International Organizations (IRENA)



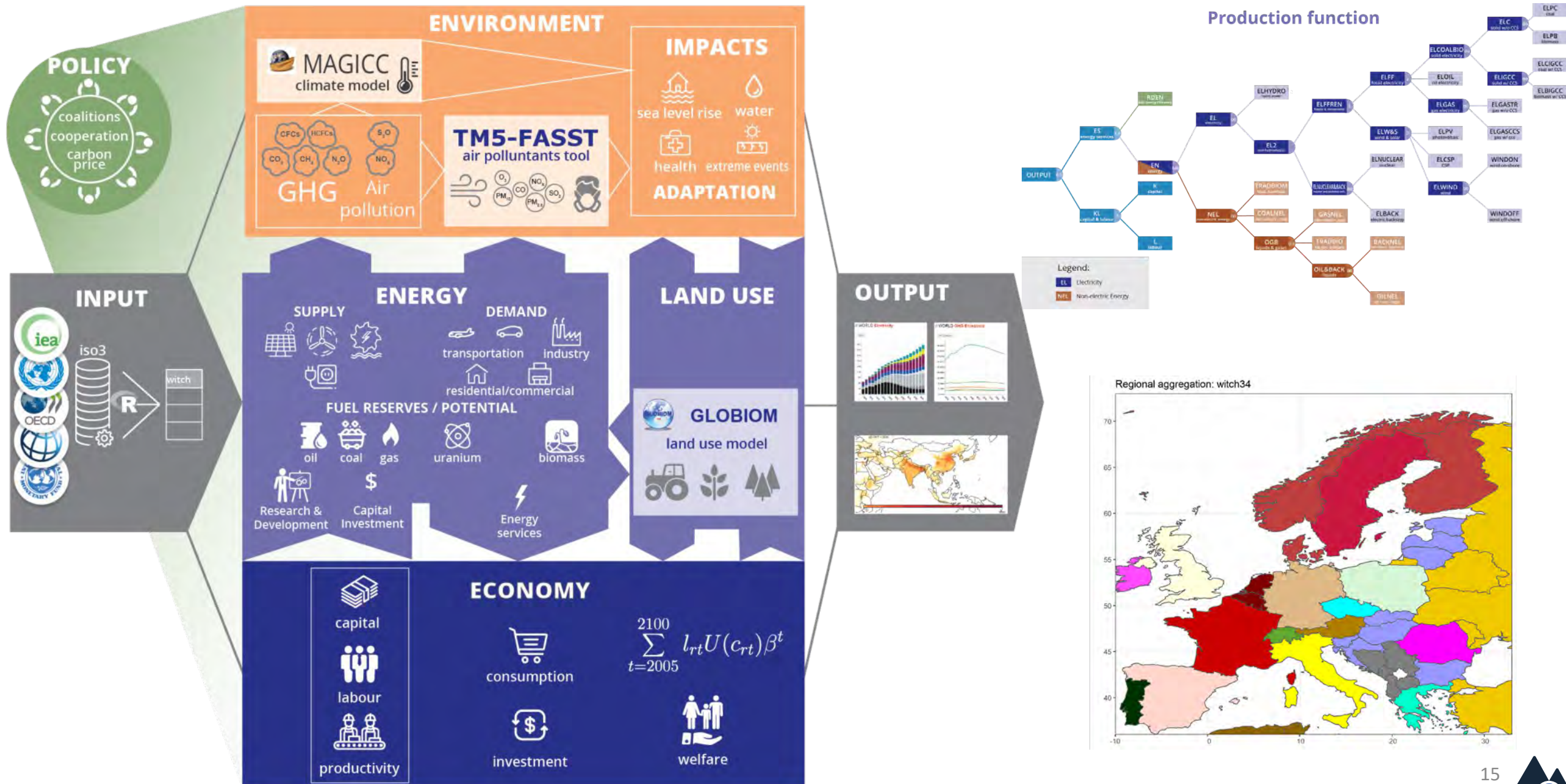
Quantifying today's global direct energy jobs

- 11 Energy Technologies
- 5 job categories
- 529 datapoints in total
- Country-level were available
- Covering 83% of total energy jobs



- **Direct jobs**
- ~~Indirect jobs (further value chain)~~
- ~~Induced jobs~~

IAM Model



- Summarizing jobs across 11 technologies, 5 job categories and countries:

$$\begin{aligned} TotalJobs = & \sum_e jobint_{e,construction} \cdot I_EN_e + \sum_e jobint_{e,manufacturing} \cdot I_EN_e \\ & + \sum_e jobint_{e,O\&M} \cdot K_EN_e + \sum_e jobint_{e,fuel_production} \cdot Q_OUT_e \\ & + \sum_e jobint_{e,refining} \cdot Q_PES_e. \end{aligned}$$

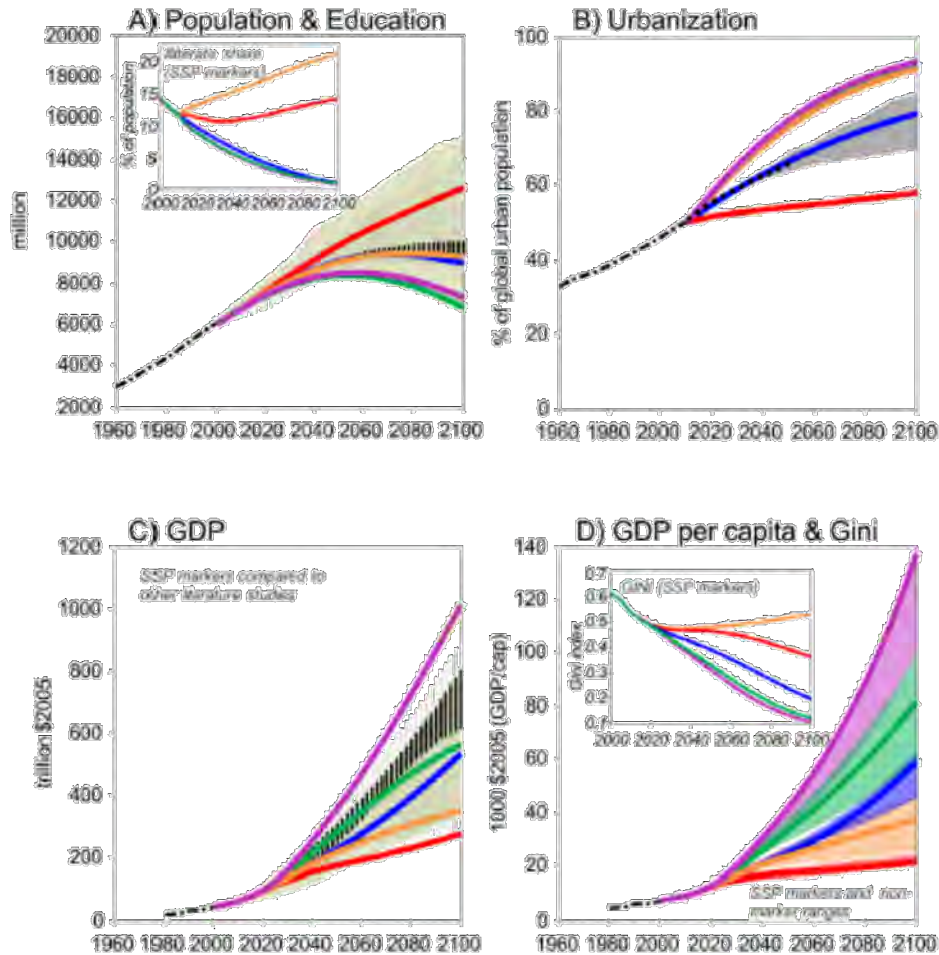
Using country-level job intensities, and energy statistics (IEA WEB, IRENA, WPDB)

→ Comparable, consistent and complete dataset across countries

→ Data analysis and visualization



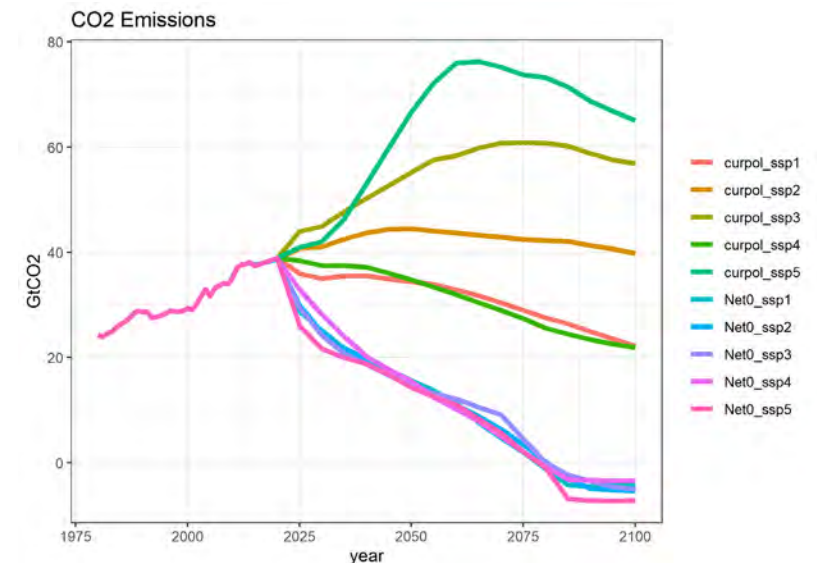
Shared Socioeconomic Pathways (SSP)



Source: Riahi et al. (2017)

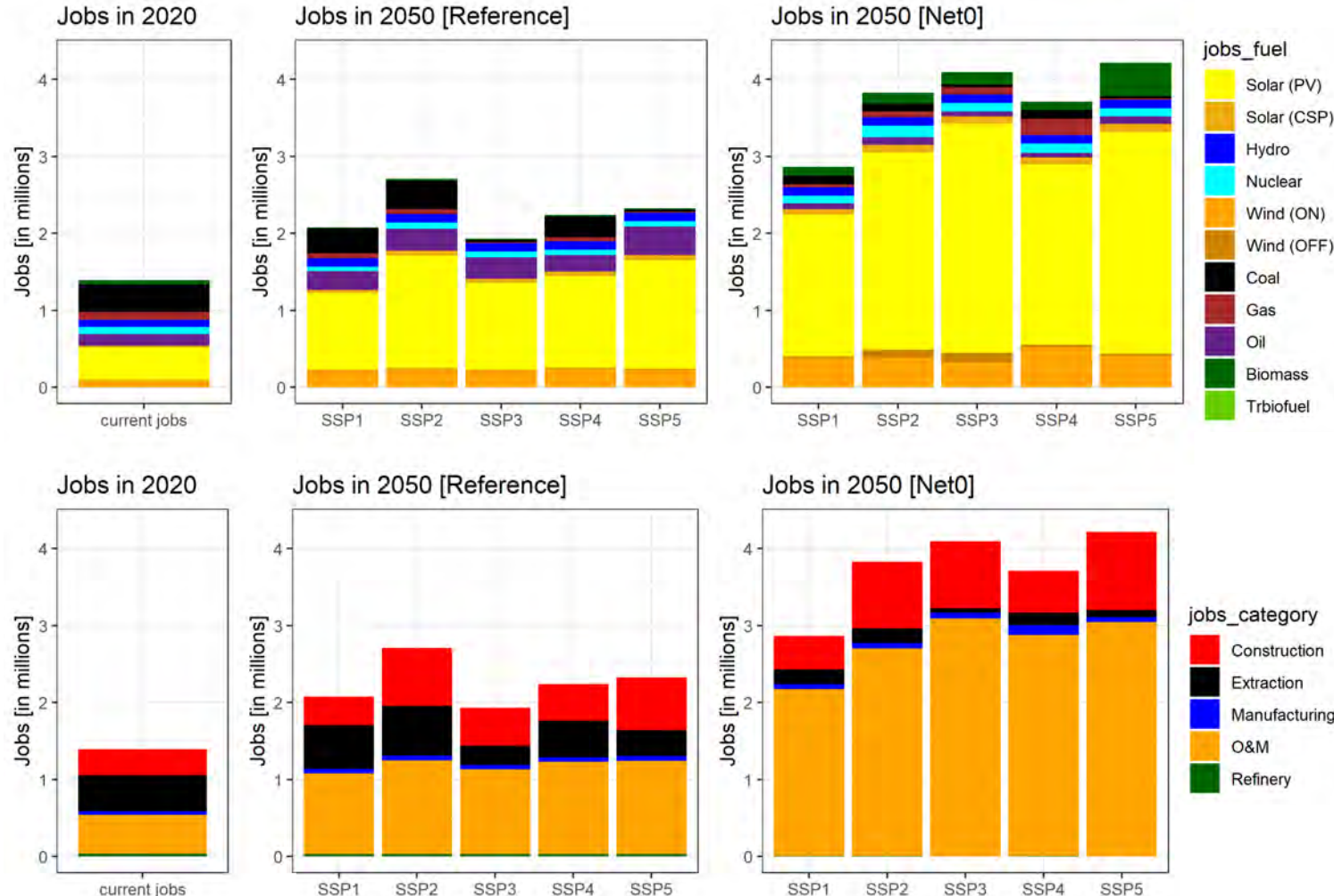
Scenarios:

1. Reference
(continued current policies as of 2020)
2. Net0 within Europe by 2050, global
WB2C carbon budget of 1150 GtCO₂



Today's Energy Jobs in Europe

- In Europe, around 1.3 million direct jobs today, expected to double (CurPol) or roughly triple (in Net0)

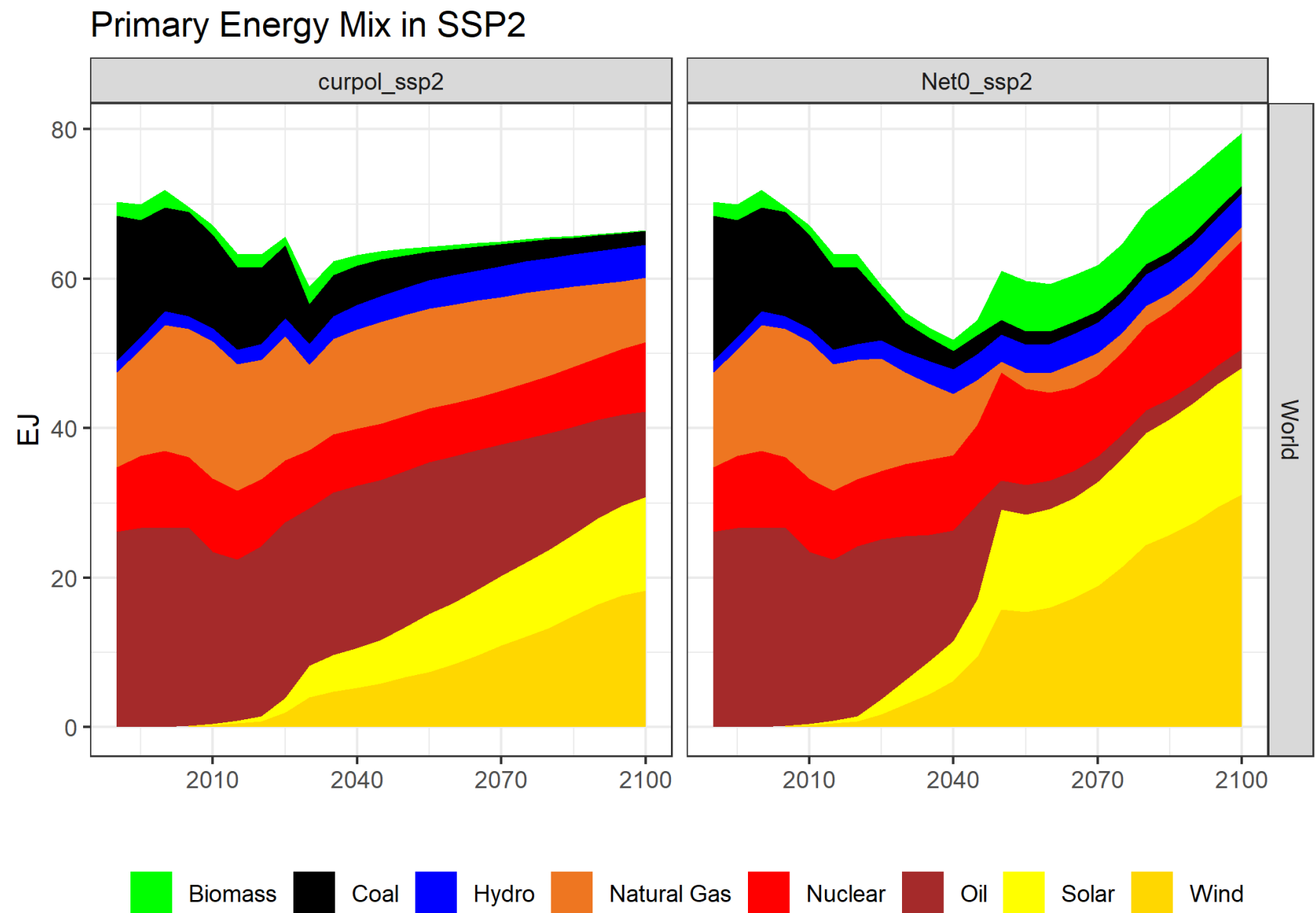


Solar highest share in the future, highest employment factor

Already in the baseline PV additions substantial

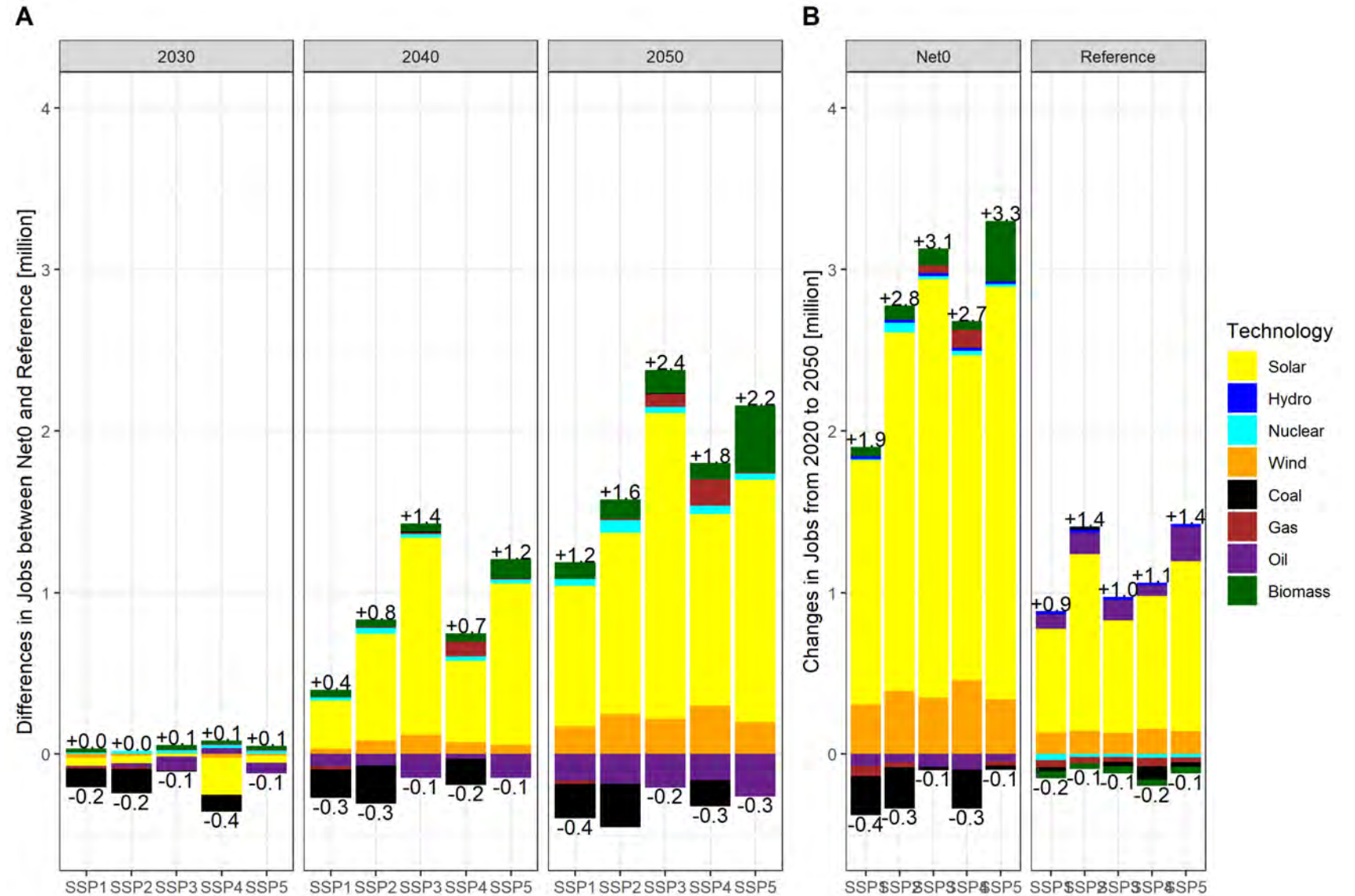
1150 Budget only (2degrees: 2-3Mio!)



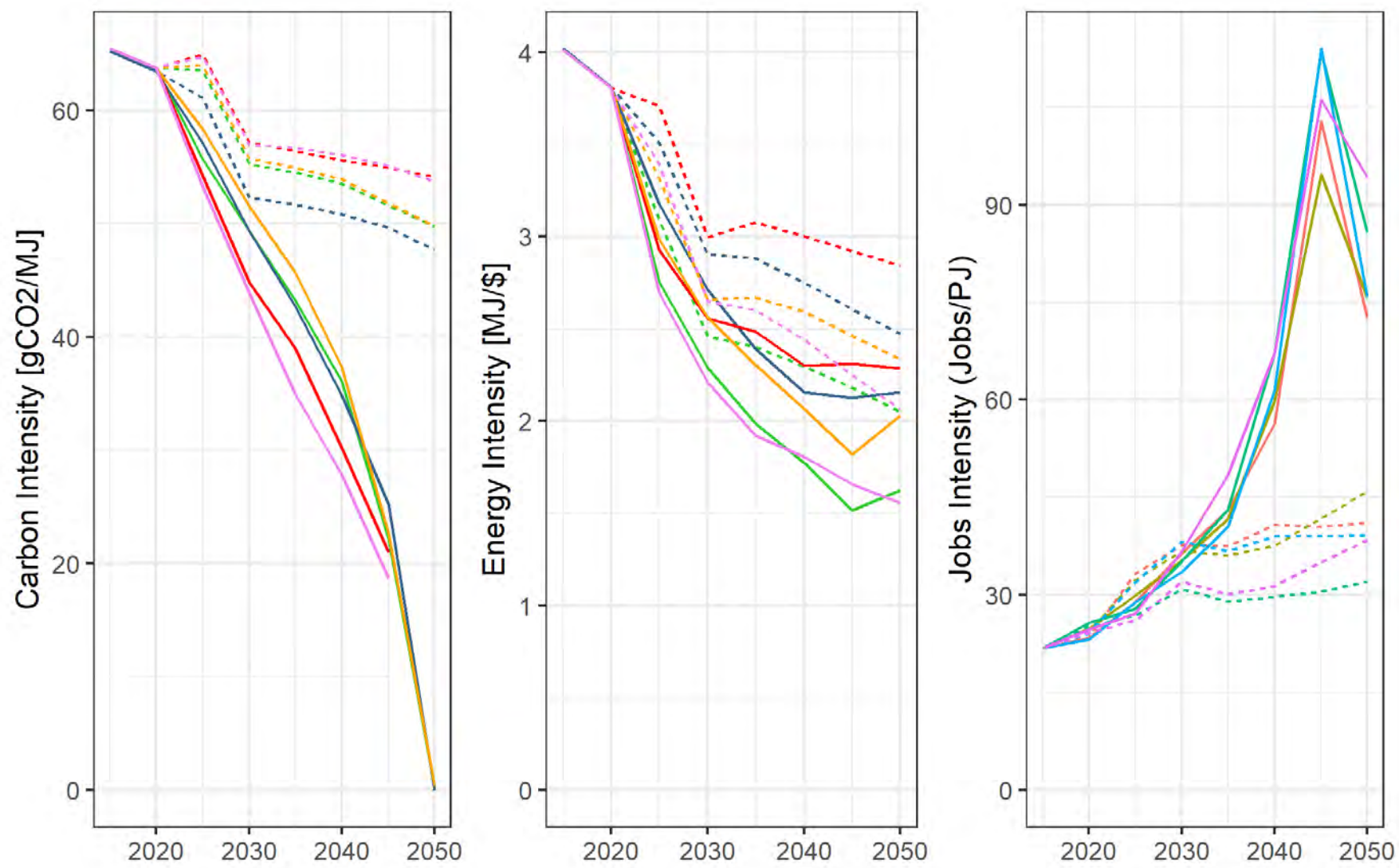


Tgains and Losses by fuels

- Extraction and Coal generation losses most



Changes over time and intensities

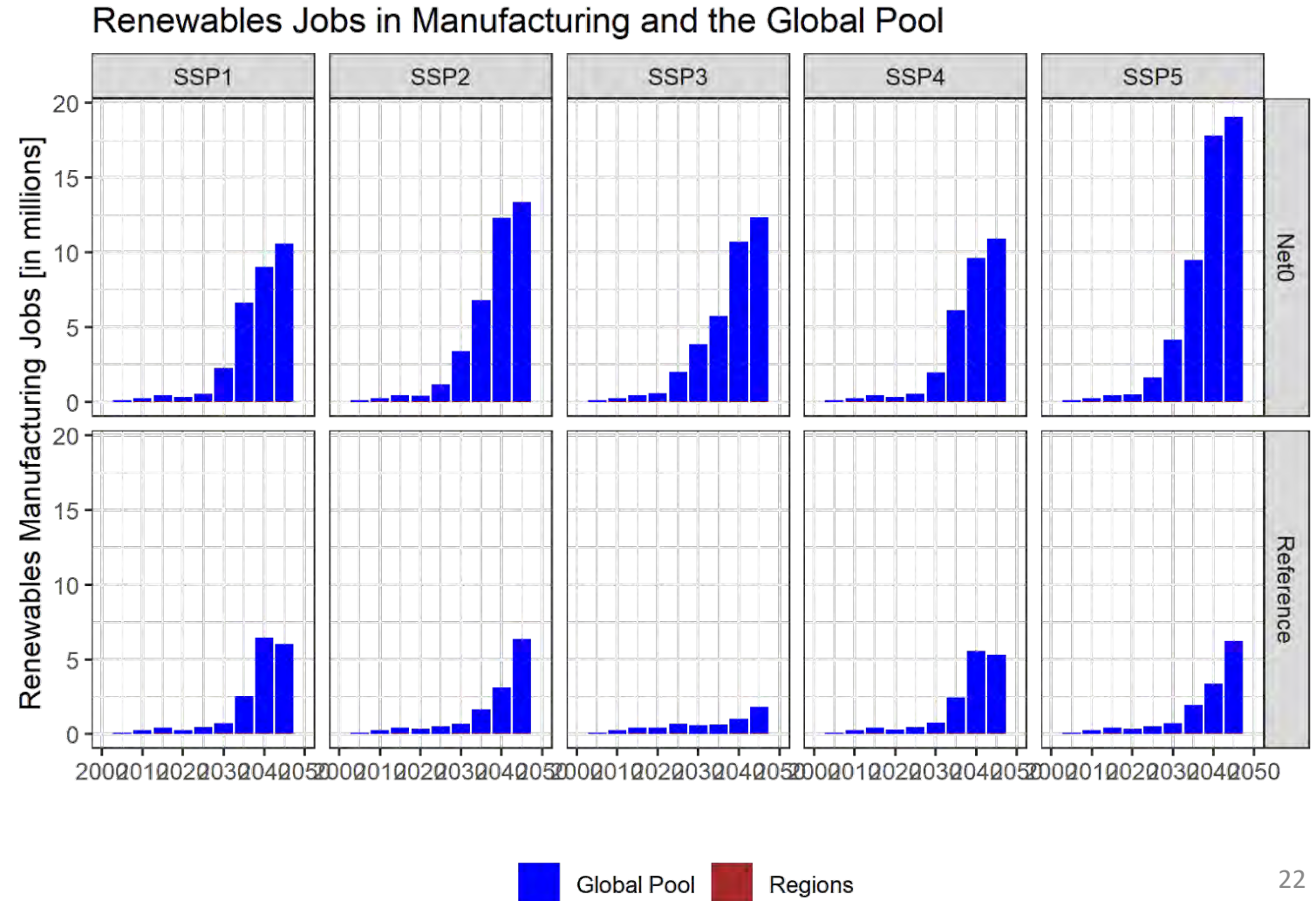


Scenario — Net0 ---- Reference SSP — SSP1 — SSP2 — SSP3 — SSP4 — SSP5

1PJ = energy consumption of about 8,000 people in EU

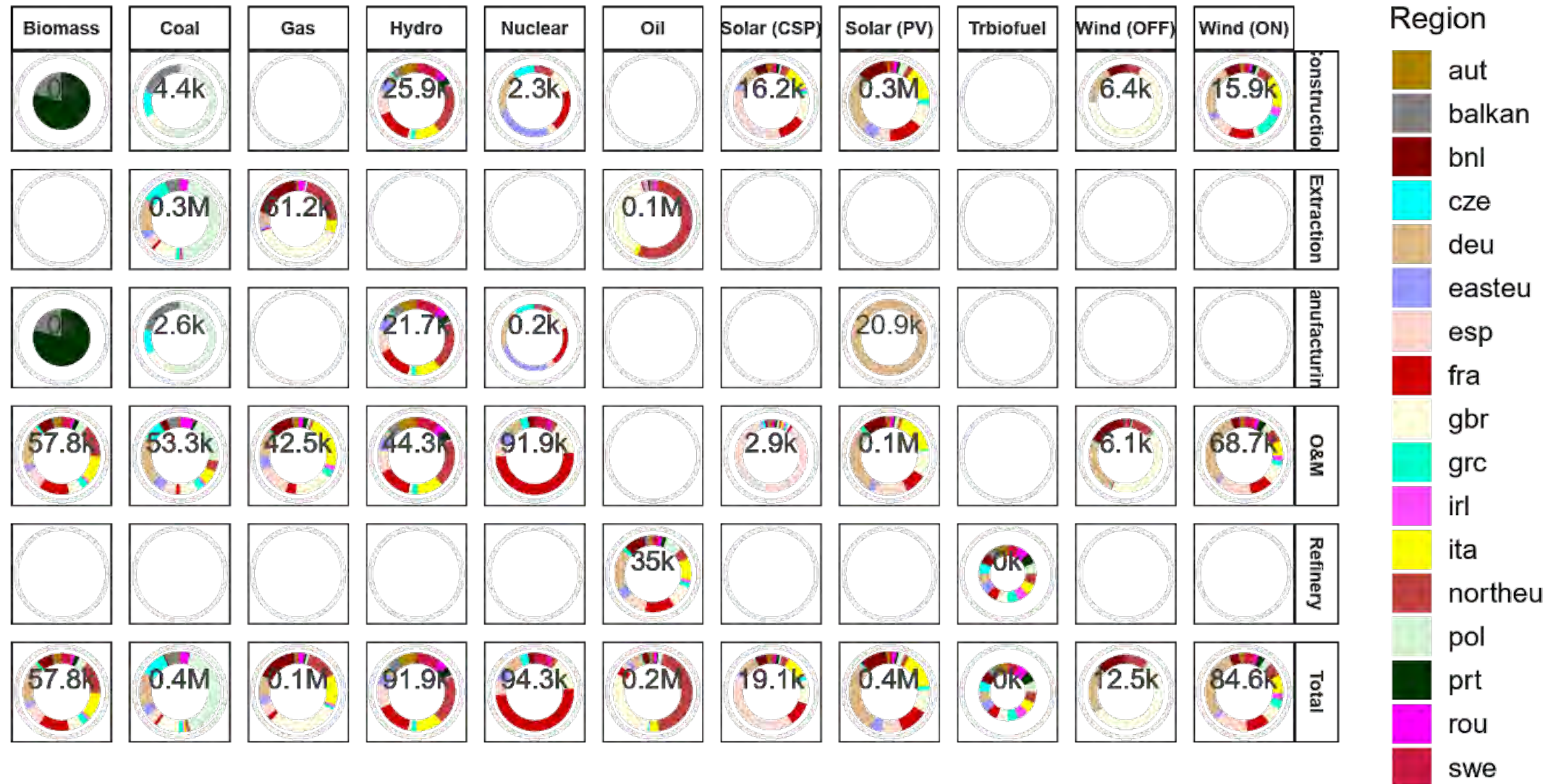


- Solar and Wind Manufacturing, country of production depends on many factors --> 10-15 millions globally, EU potential depends mostly on industrial policy



Energy Jobs across countries in 2020

Jobs across regions in 2020

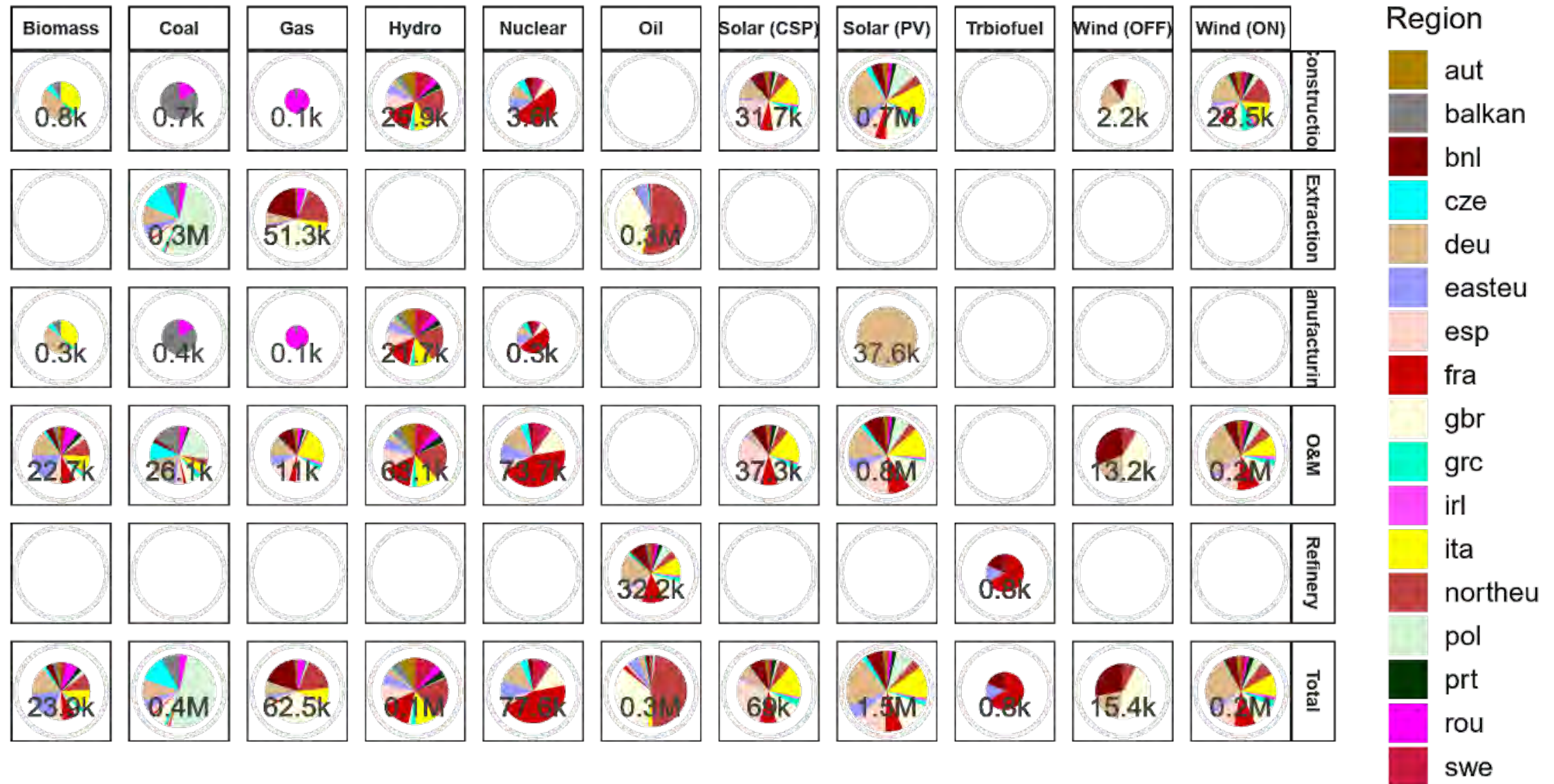


Size shows log10 of total jobs



Energy Jobs across countries in 2050 (Reference)

Jobs across regions in 2050 [Reference]

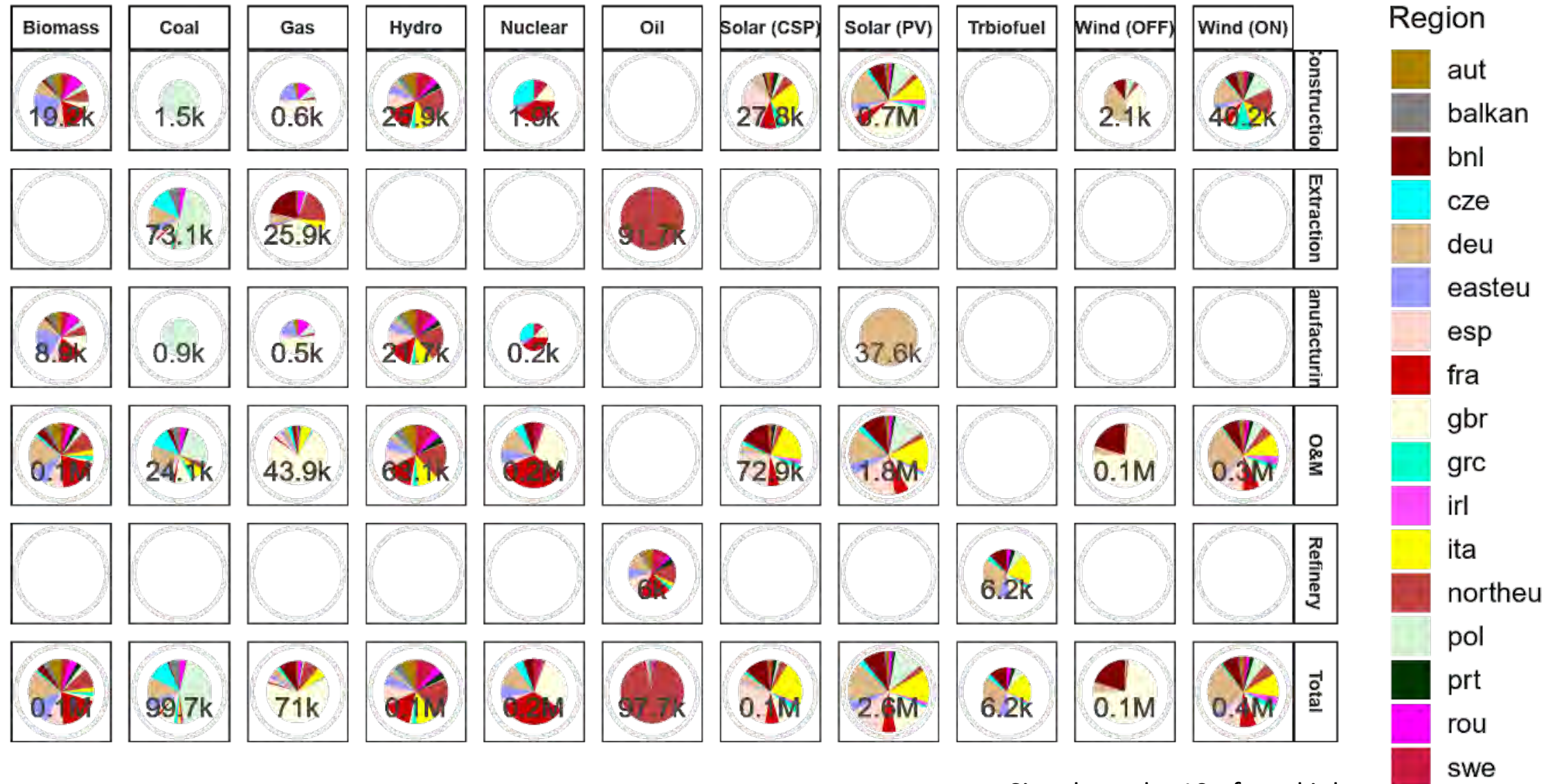


Size shows log10 of total jobs



Energy Jobs across countries in 2050 (Net0)

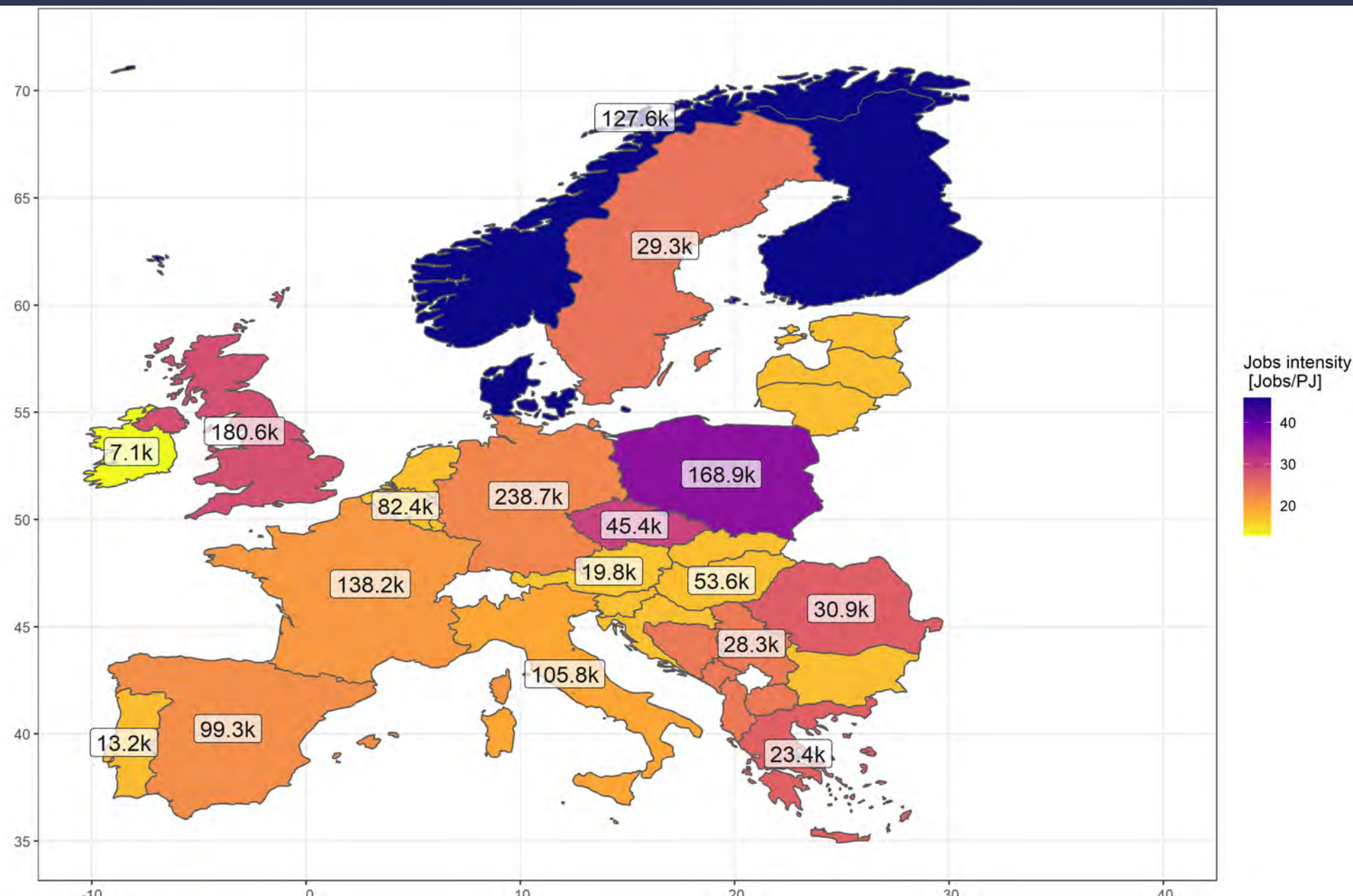
Jobs across regions in 2050 [Net0]



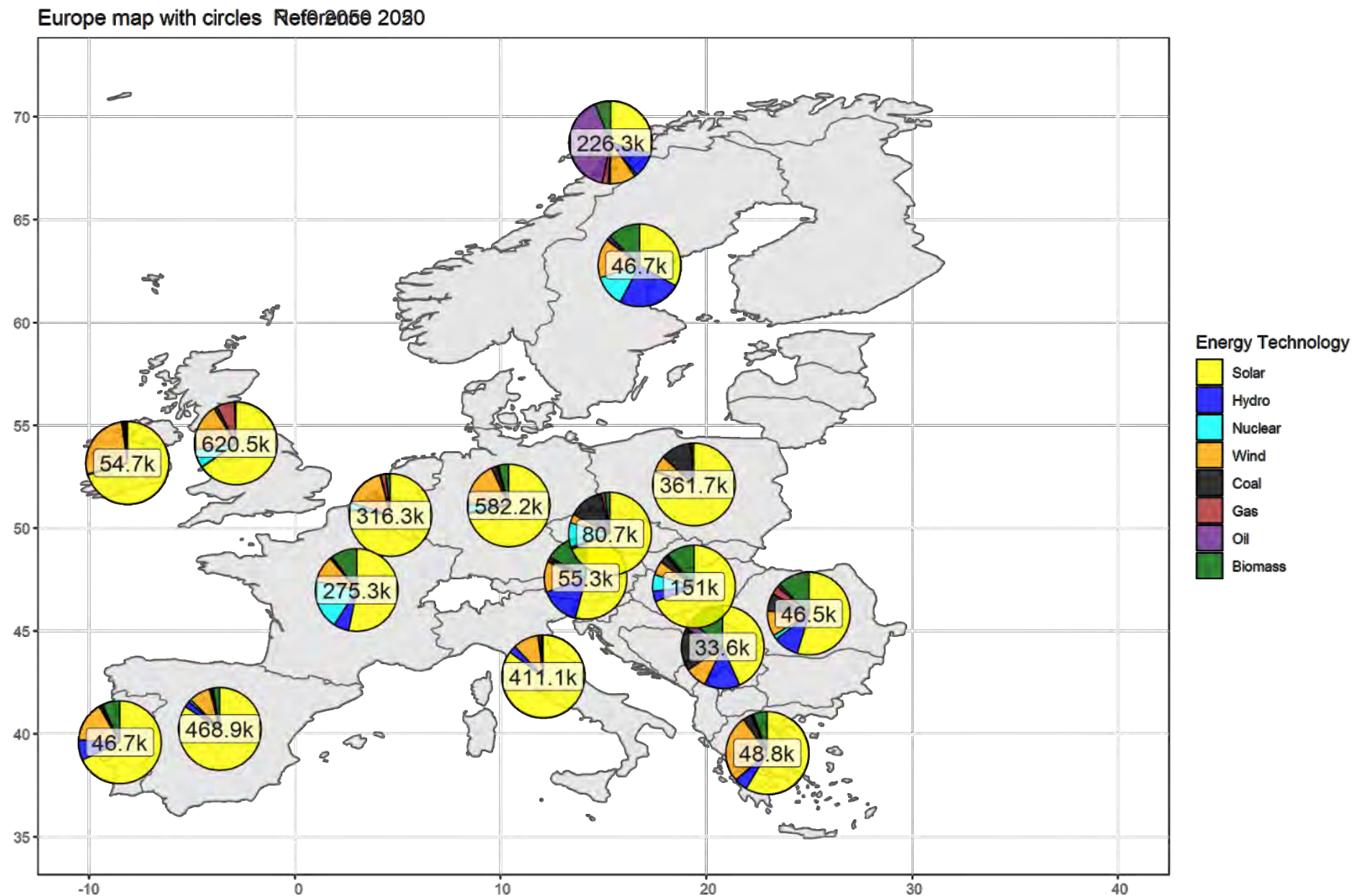
Size shows log10 of total jobs



Results for the EU (Reference, 2020)

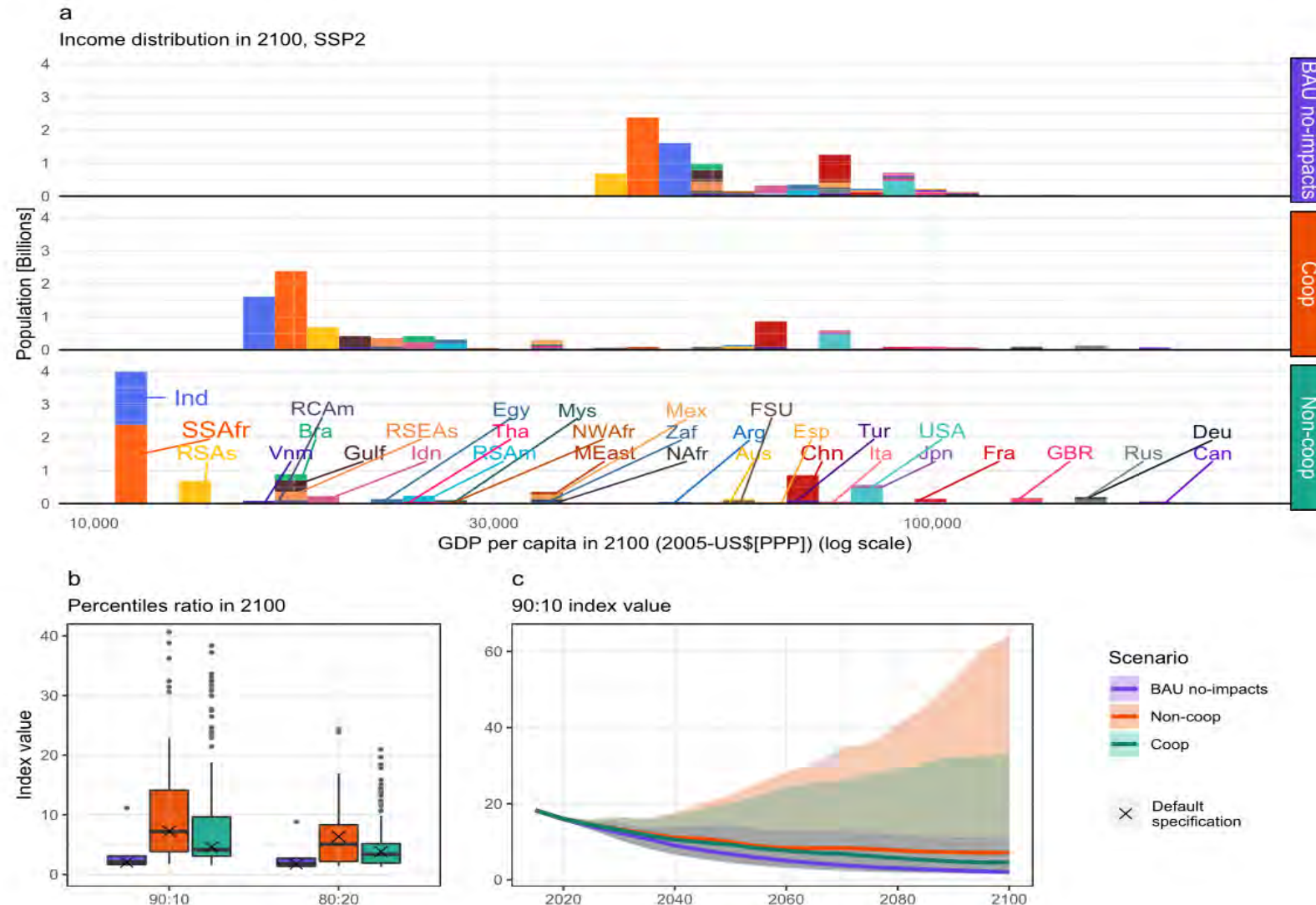


Results for the EU (2020 and 2050)



Distributional incidence of mitigation, impacts, and redistribution

- RICE50+ model, CB-IAM, almost at country level, DICE based



Source: Gazzotti, Paolo, Johannes Emmerling, Giacomo Marangoni, Andrea Castelletti, Kaj-Ivar van der Wijst, Andries Hof, and Massimo Tavoni. 'Persistent Inequality in Economically Optimal Climate Policies'. *Nature Communications* 12, no. 1 (8 June 2021): 3421. <https://doi.org/10.1038/s41467-021-23613-y>.



Distributional incidence of mitigation, impacts, and redistribution

► Welfare:

$$W = \sum_{t=1}^T \left[\frac{1}{1-\eta} \left(\sum_{n \in clt} l_{t,n} \left(\frac{Y_{t,n}(1-s_{t,n})}{l_{t,n}} \right)^{\frac{1-\eta}{1-\gamma}} \right) - 1 \right] (1+\rho)^t$$

now based on deciles in the optimization

► Welfare function:

$$W = \sum_{t=1}^T \left[\frac{1}{1-\eta} \left(\sum_{n \in clt} l_{t,n} \left(\left(\sum_{dist=1}^{10} \left(\frac{Y_{t,n,dist}(1-s_{t,n})}{l_{t,n}/10} \right)^{1-\gamma^{int}} \right)^{\frac{1}{1-\gamma^{int}}} \right)^{1-\gamma} \right)^{\frac{1-\eta}{1-\gamma}} - 1 \right] (1+\rho)^t$$



Distributional incidence of mitigation, impacts, and redistribution

- ▶ Baseline quantiles $q_{dist,t,n}^{ref}$ based on SSP projection

$$YGROSS_{t,n,dist} = YGROSS_{t,n} * q_{dist,t,n}^{ref} \quad (1)$$

- ▶ Income across deciles:

$$\begin{aligned} Y_{t,n,dist} &= YGROSS_{t,n,dist} \\ &- DAMAGES_{t,n} * w_{t,n,dist}^{\xi} \\ &- (ABATECOST_{t,n} + ctax_t * EIND_{t,n}) * w_{t,n,dist}^{\omega} \\ &+ TRANSFER_{t,n,dist} \end{aligned} \quad (2)$$

with

$$w_{t,n,dist}^{\xi} = \frac{\left(q_{t,n,dist}^{ref}\right)^{\xi}}{\sum_{dist} \left(q_{t,n,dist}^{ref}\right)^{\xi}} \text{ and } w_{t,n,dist}^{\omega} = \frac{\left(q_{t,n,dist}^{ref}\right)^{\omega}}{\sum_{dist} \left(q_{t,n,dist}^{ref}\right)^{\omega}}. \quad (3)$$

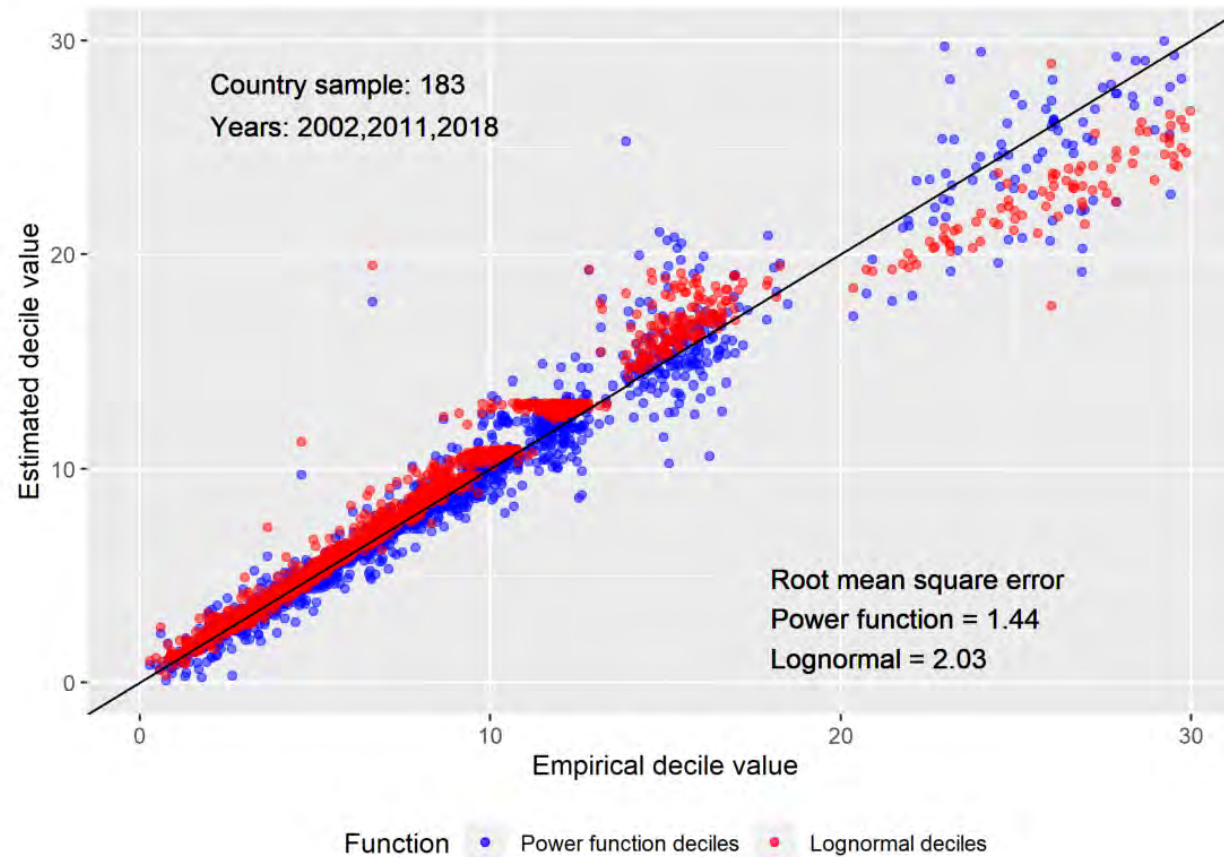
- ▶ Redistribution of carbon tax revenues as

$$\sum_{dist} TRANSFER_{t,dist} = ctax_t * EIND_t$$



Lognormal vs. deciles based inequality

- ▶ Lognormal assumption vs. Deciles
- ▶ 1961 to 2018 projection and fit comparison



Distributional incidence of mitigation, impacts, and redistribution

Decomposition based on the Theil index $GE(0)$ $GE(0) = \frac{1}{N} \sum_{i=1}^N \ln \left(\frac{N^{-1} \sum_{i=1}^N x_i}{x_i} \right)$

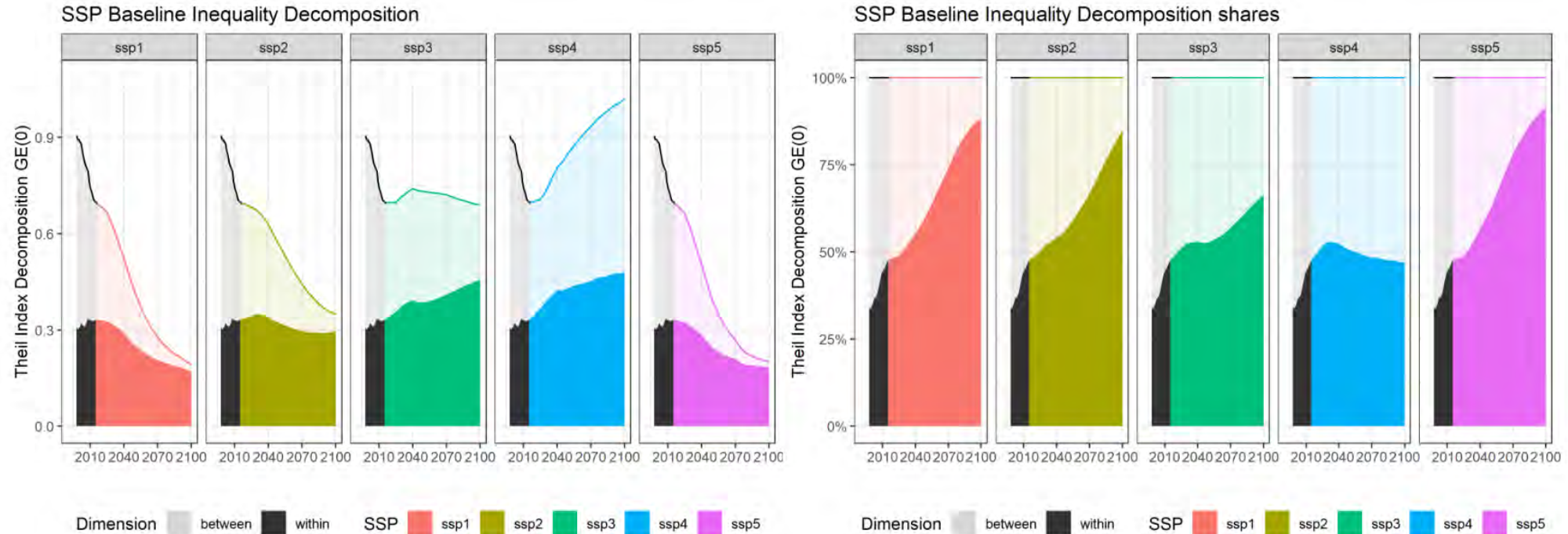
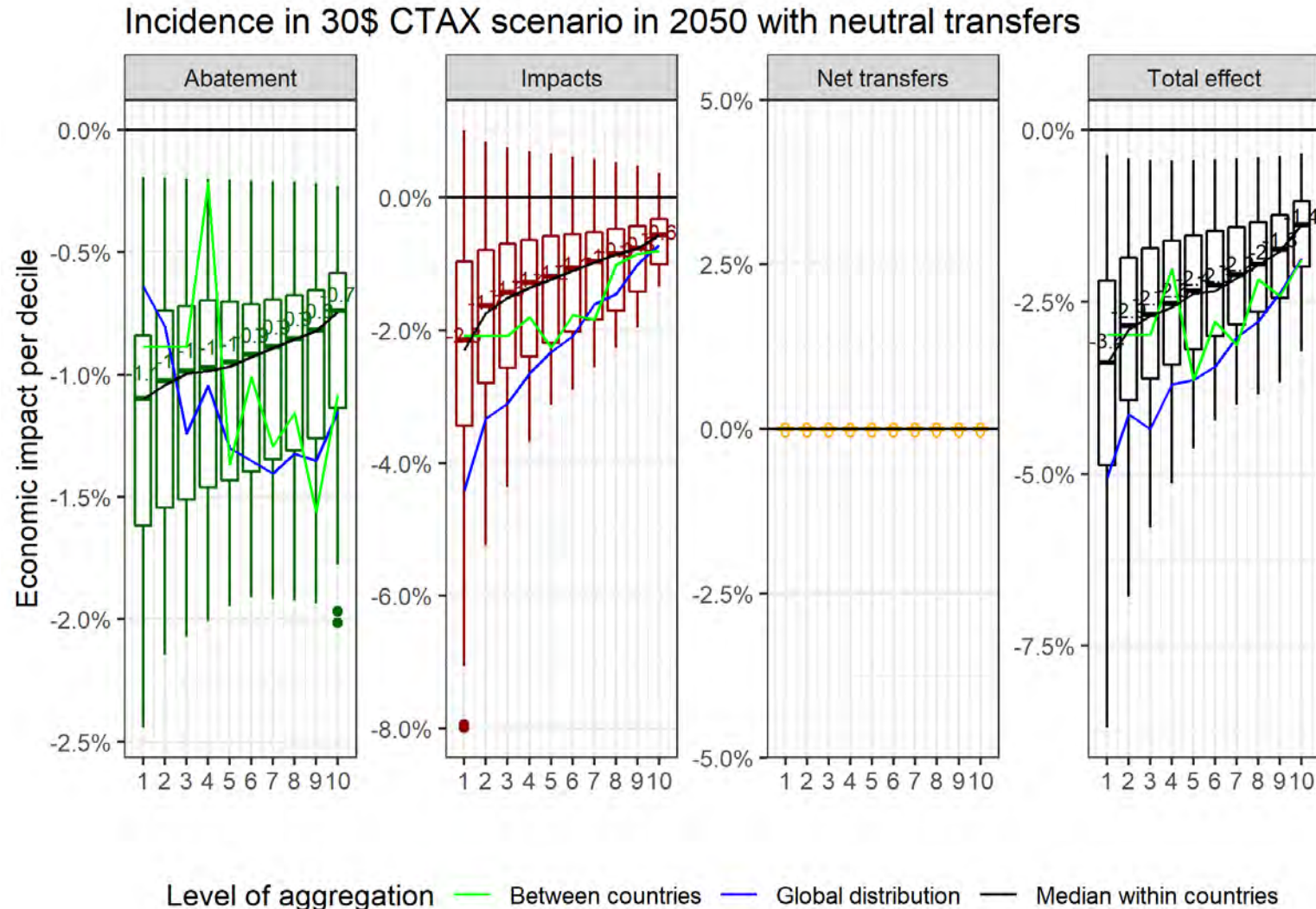


Figure: Inequality decomposition (left) and full income distribution in 2014 and 2050 across SSPs (right)

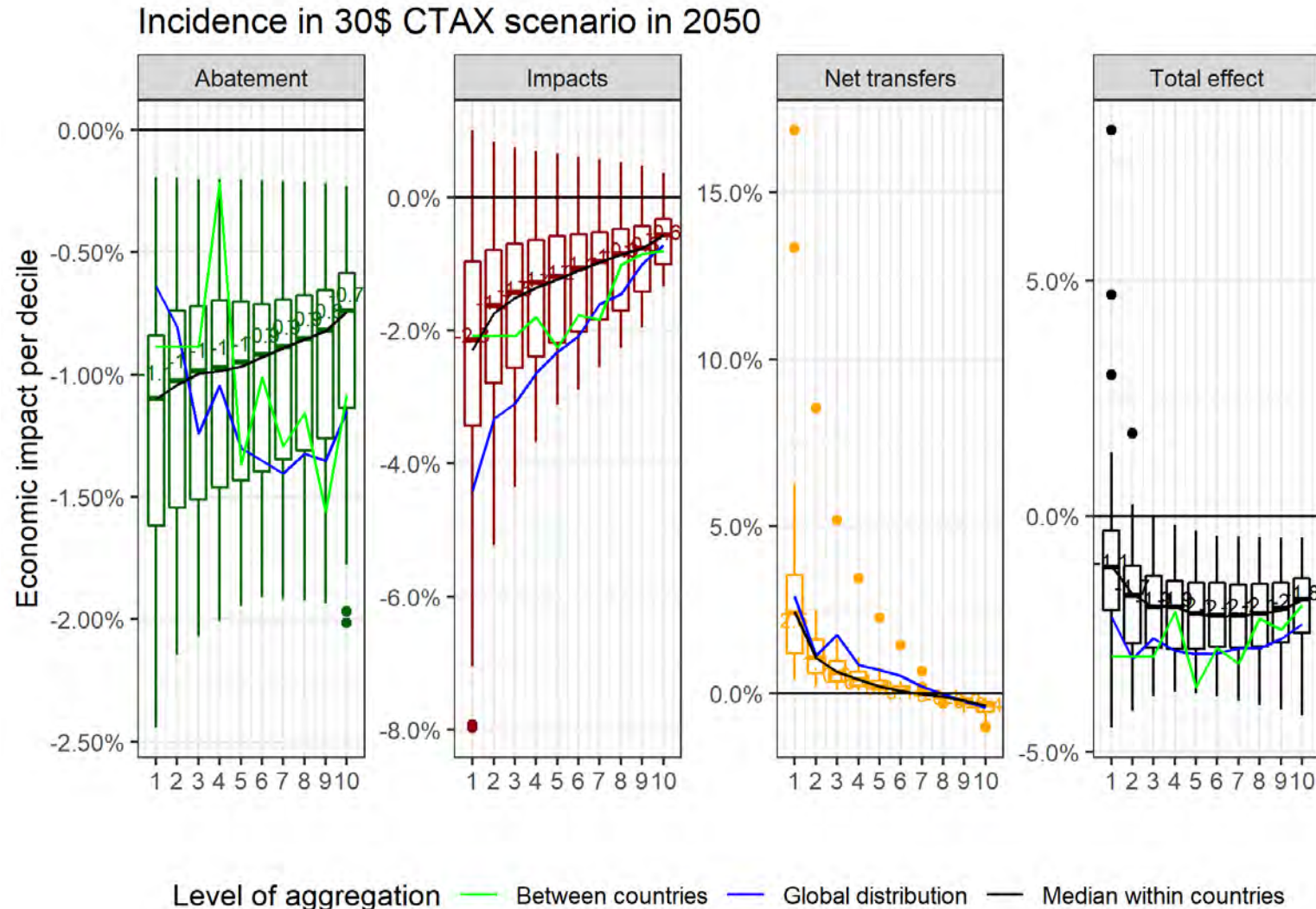
Distributional incidence of mitigation, impacts, and redistribution

- RICE50+ model, CB-IAM, almost at country level, DICE based



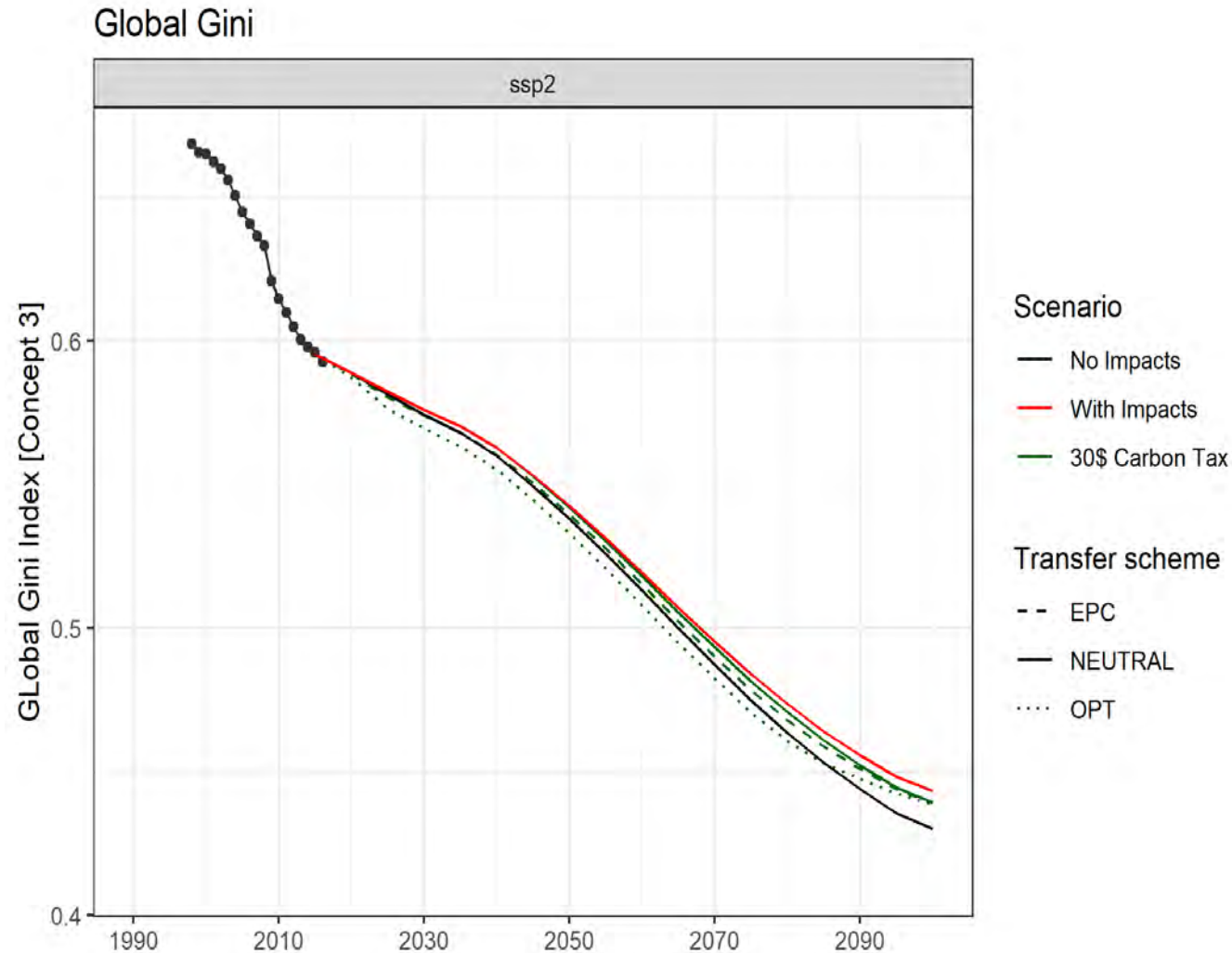
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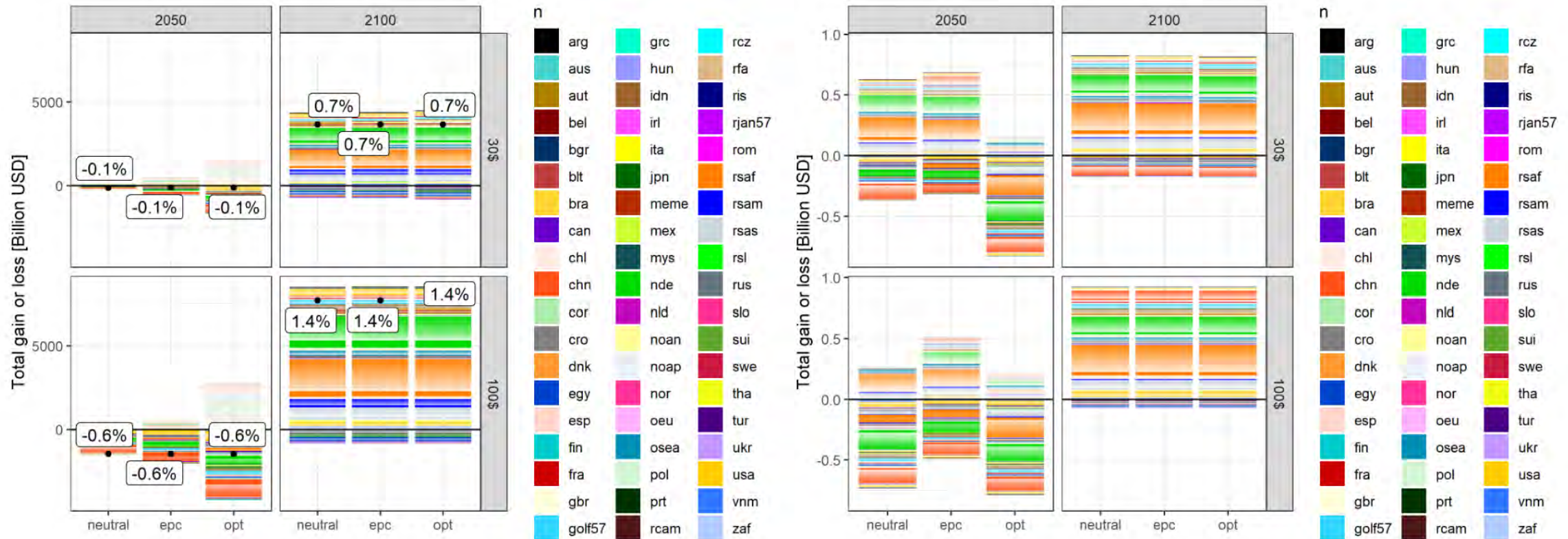


Distributional incidence of mitigation, impacts, and redistribution

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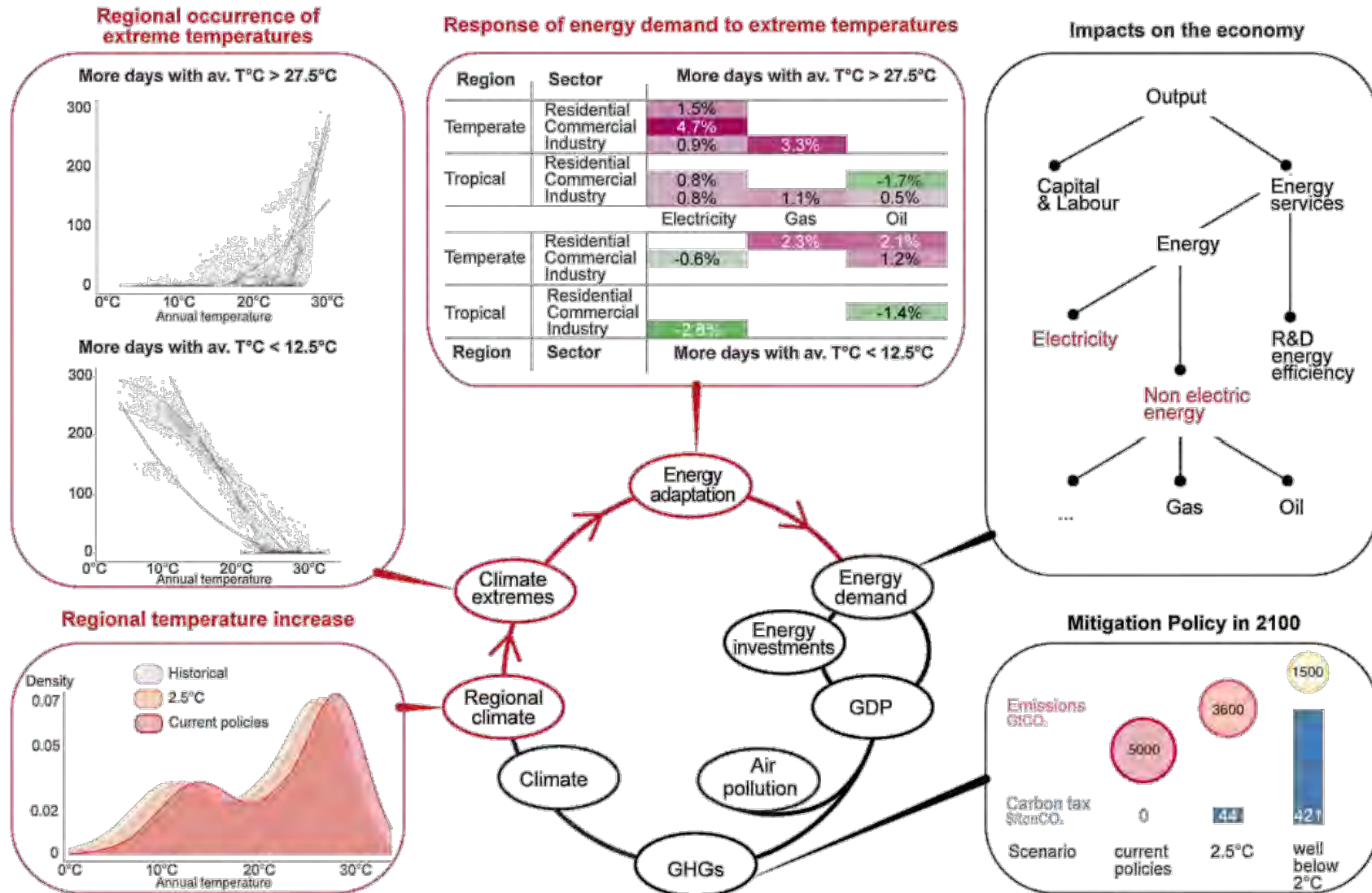
Distributional incidence of mitigation, impacts, and redistribution



Impacts and the Integration with Equity, Mitigation, and Adaptation

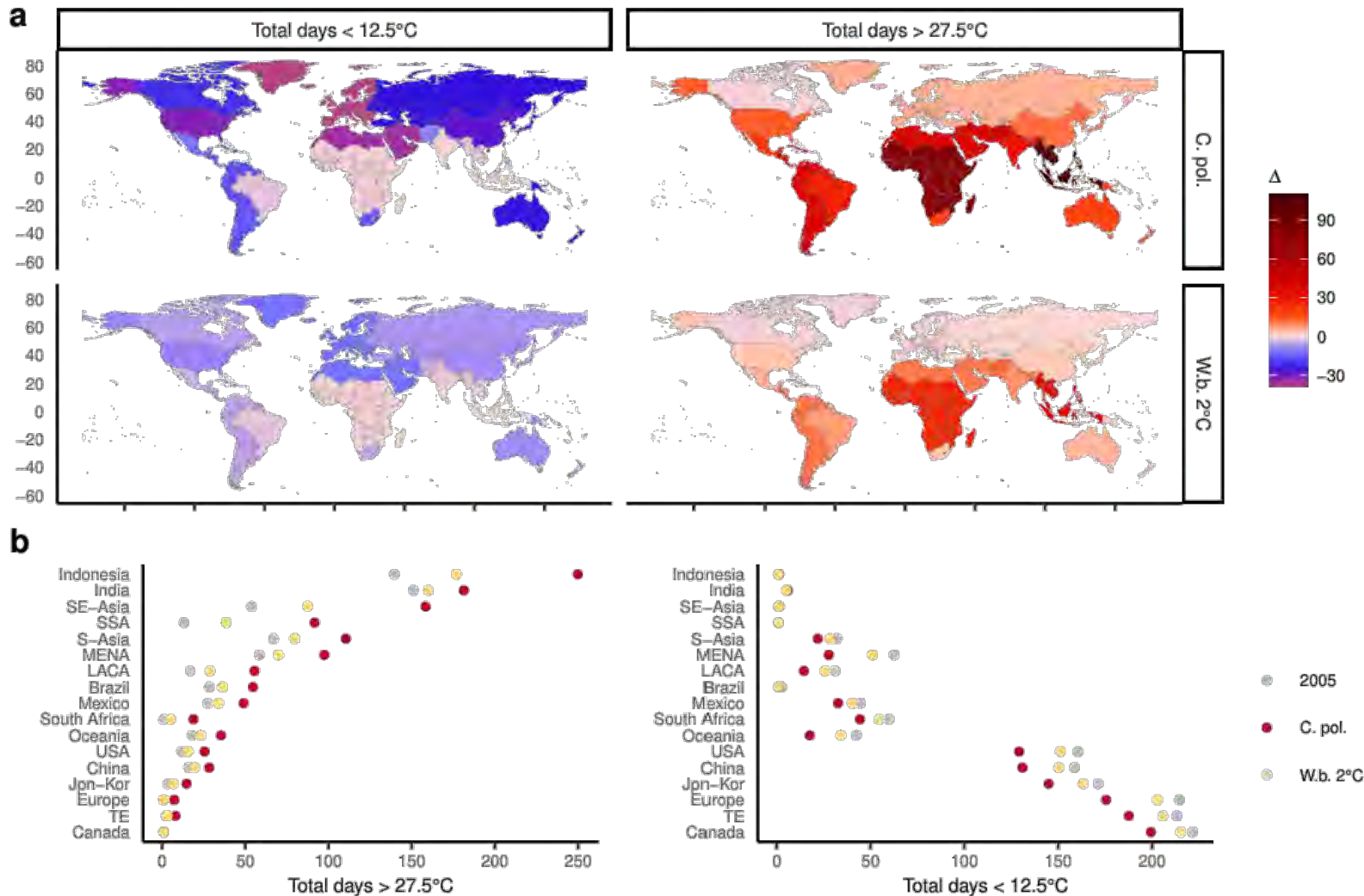


- Mitigation, Impacts, and Adaptation: here on Energy Demand



Source: Colelli, Emmerling et al., 2022, forthcoming NComms

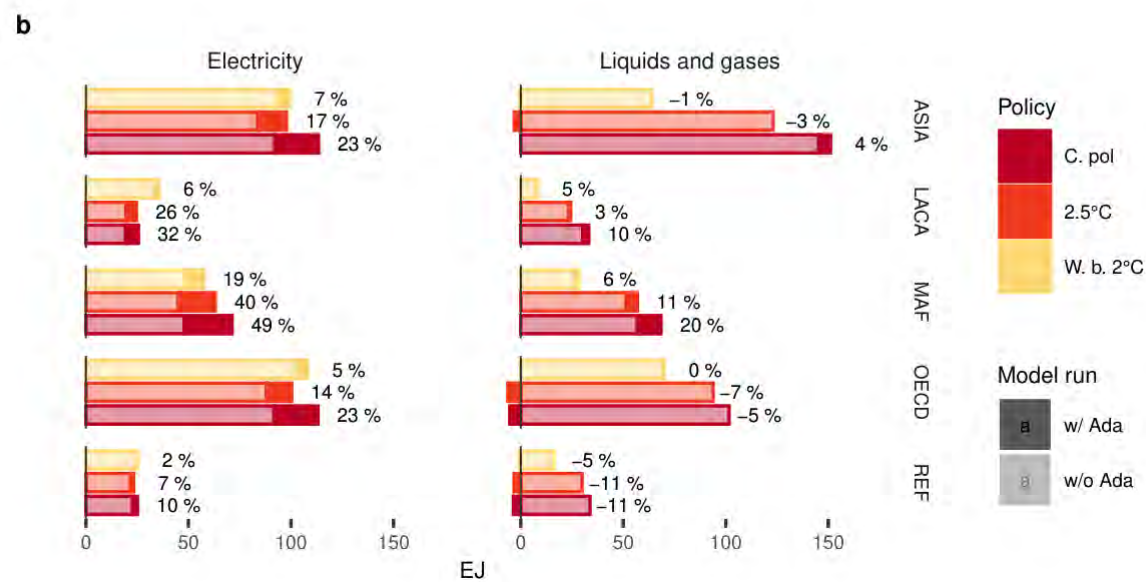
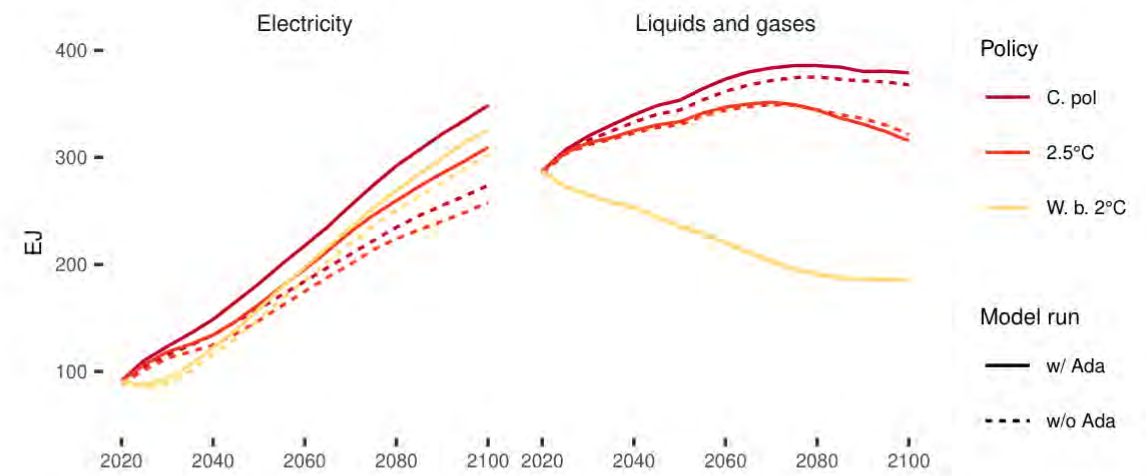
- Mitigation, Impacts, and Adaptation: here on Energy Demand



Source: Colelli, Emmerling et al., 2022, forthcoming NComms



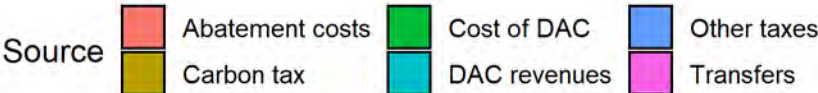
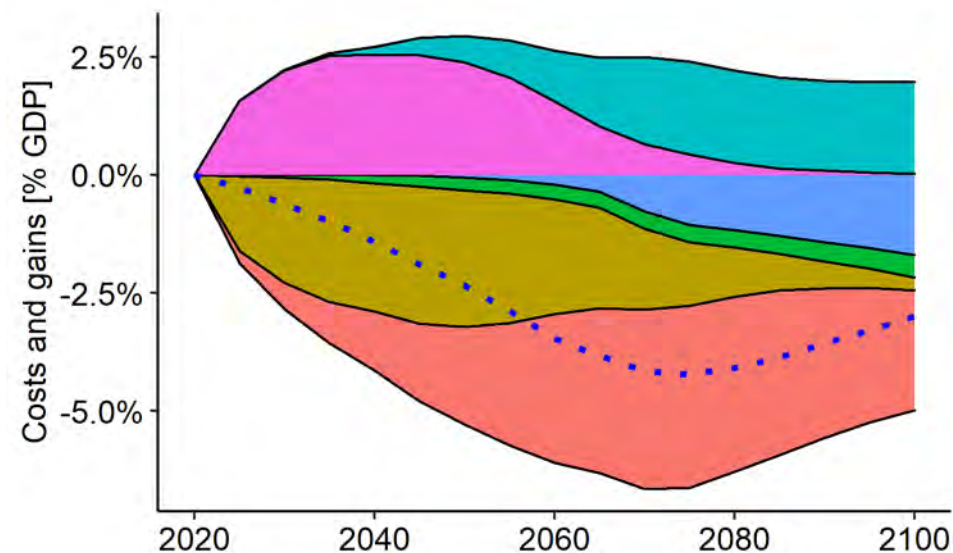
Mitigation, Impacts, and Adaptation: here on Energy Demand



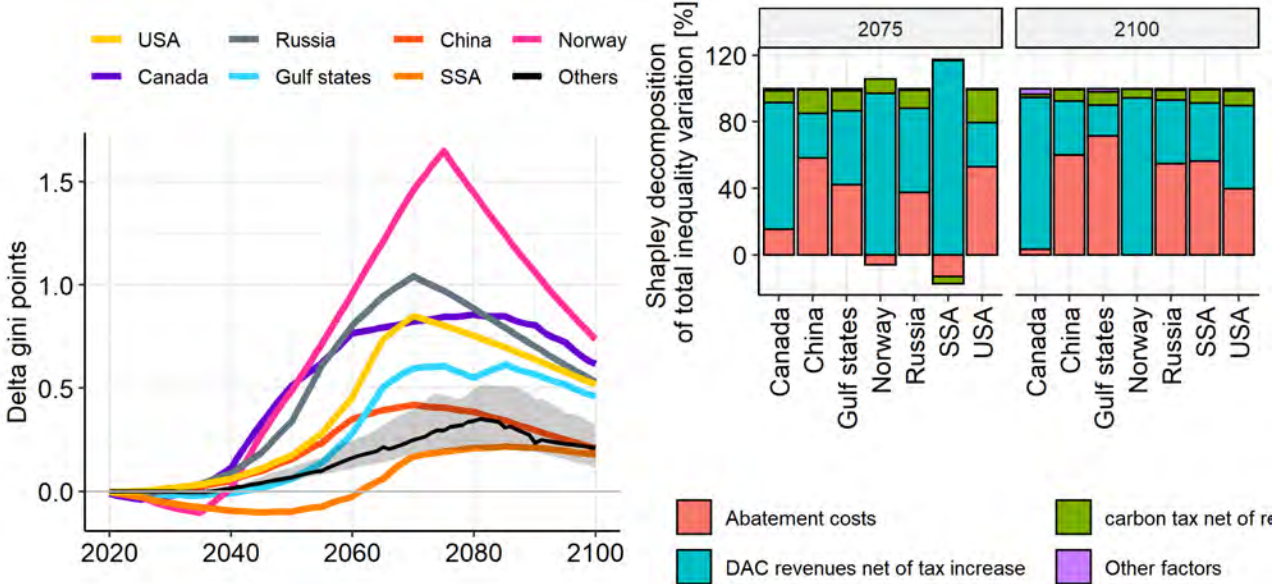
Source: Colelli, Emmerling et al., 2022, forthcoming NComms



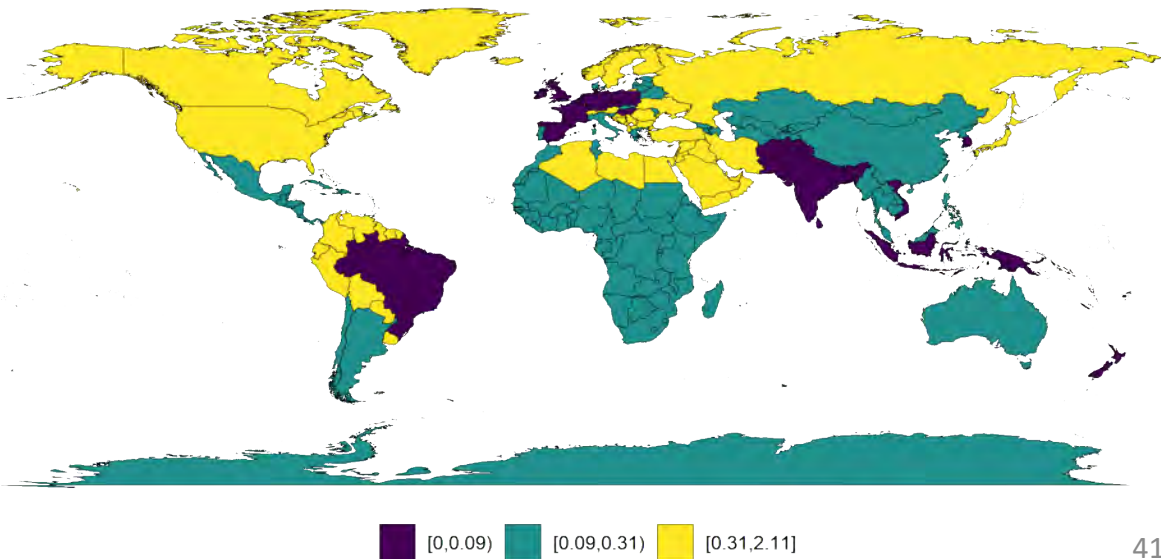
DAC and Inequality



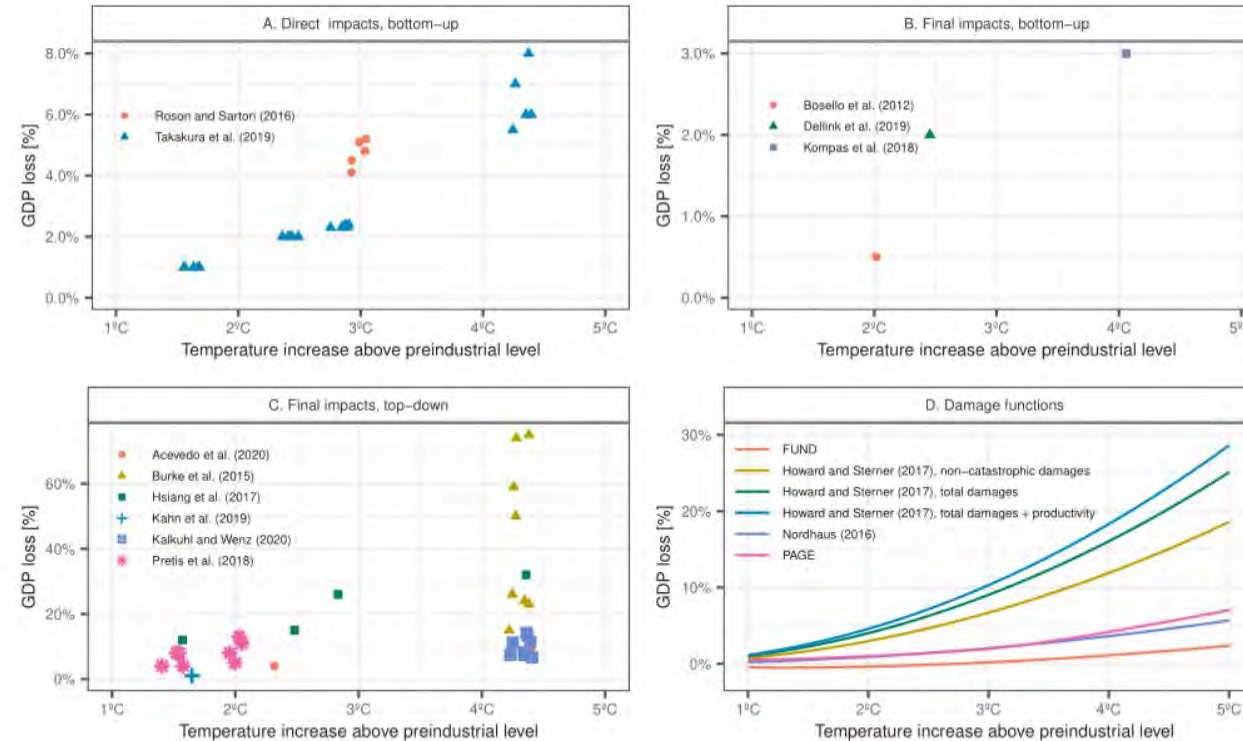
Aggregated financial flows in a 1.5deg scenario



Gini index variation due to CDR in 2075



Climte Impacts - Macroeconomic effects on GDP and damage functions

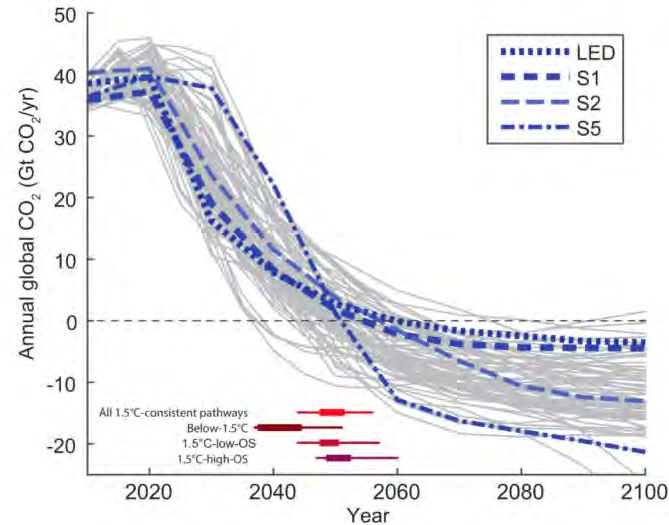


Source: Piontek *et al.* (2021)

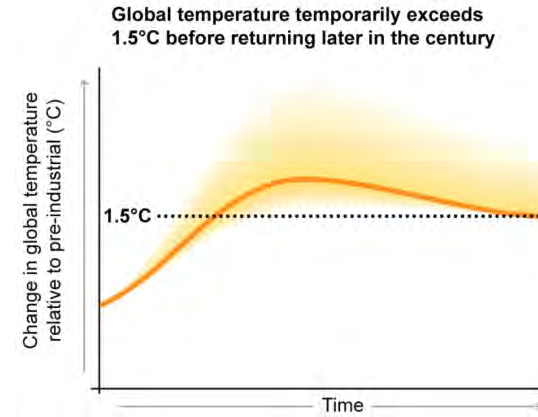
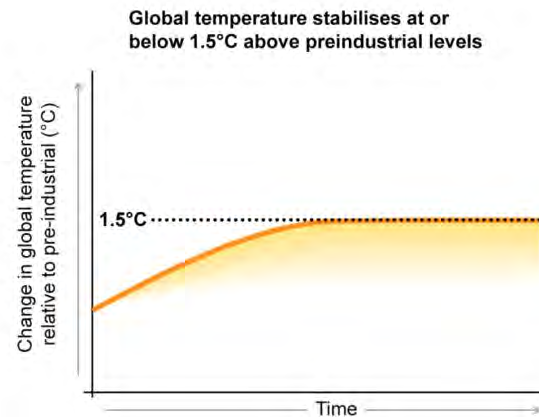
1. Burke *et al.* (2015), growth-based, final impact, top-down
2. Howard & Sterner (2017), level-based, damage function, meta-analysis
3. Takakura *et al.* (2019), level-based, direct impact, bottom-up



Climate IMPACTS – post processed implementation and



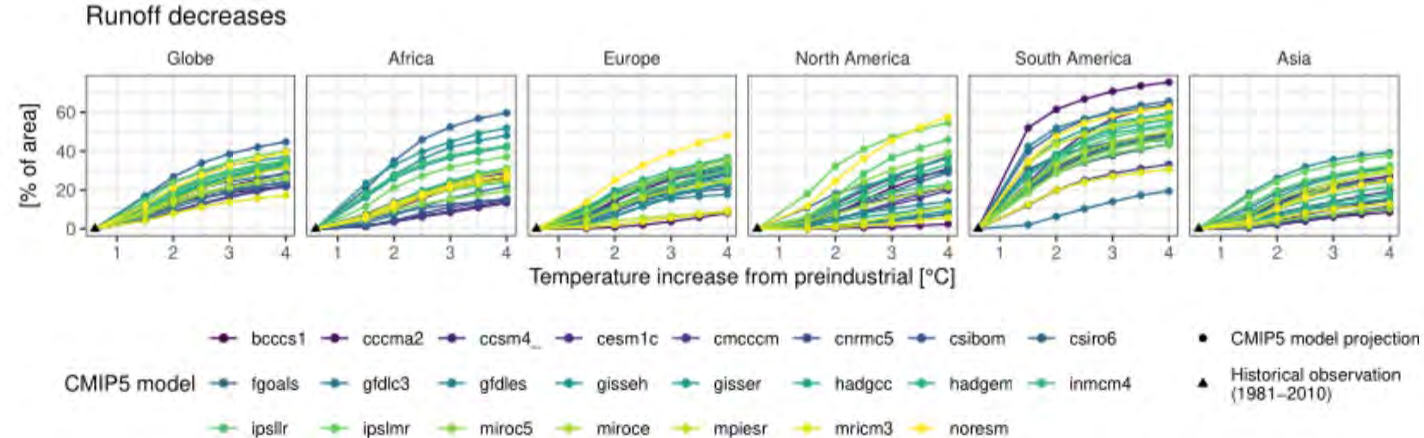
- Many trajectories for climate stabilization
- Importance of baseline and time discounting
- Allow for temperature exceedence: 'overshoot'
- Rely on negative emissions



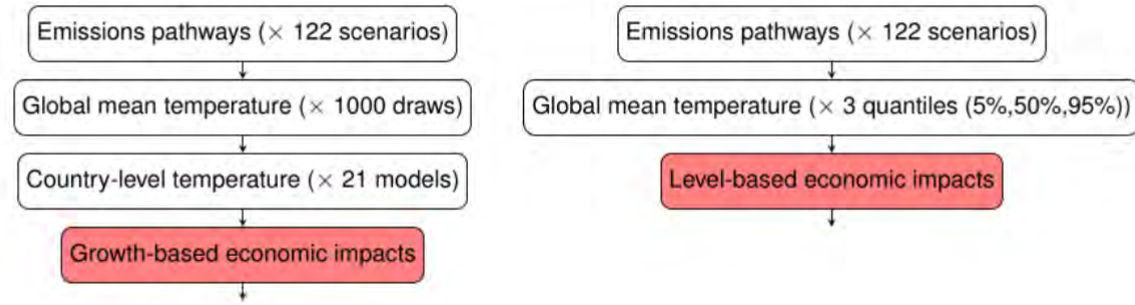
Source: IPCC SR 1.5C

We apply 15 impact response functions (Arnell *et al.*, 2019). Global + 5 regions. 23 CMIP5 models.

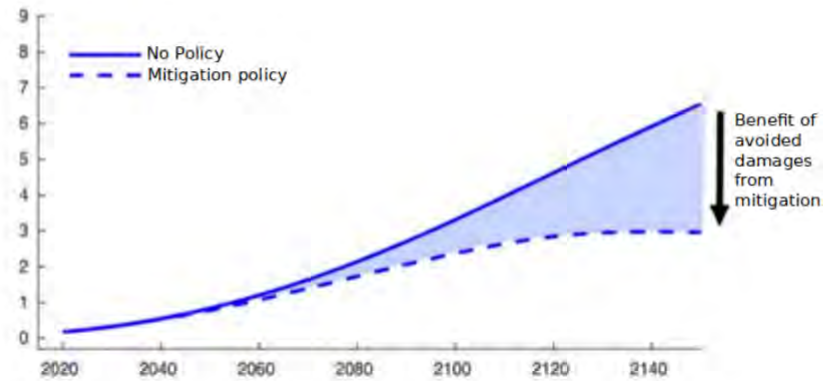
Agricultural drought frequency [% chance], duration [% of time]
Frost days [days/years], Heating Degree Days [$^{\circ}\text{C}$]
(Major) Heatwave frequency [% chance], duration [days/years], Cooling degree days [$^{\circ}\text{C}$]
Reduction in crop duration [days]: Maize, Rice, Soybean, Spring/Winter Wheat
Runoff increases, decreases [% of area]



Computation of economic impacts



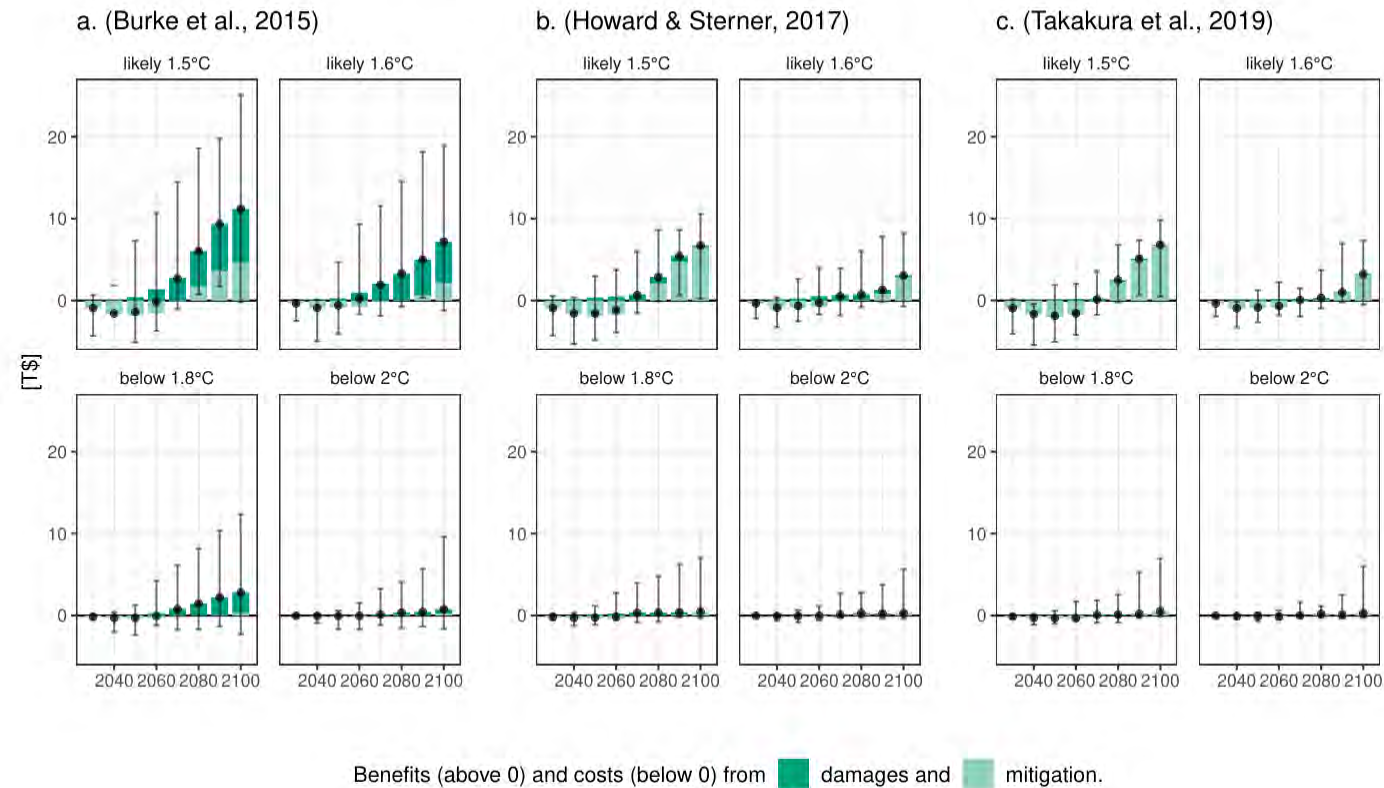
Avoided impacts



Brown *et al.* (2020)



Global net benefits from not overshooting

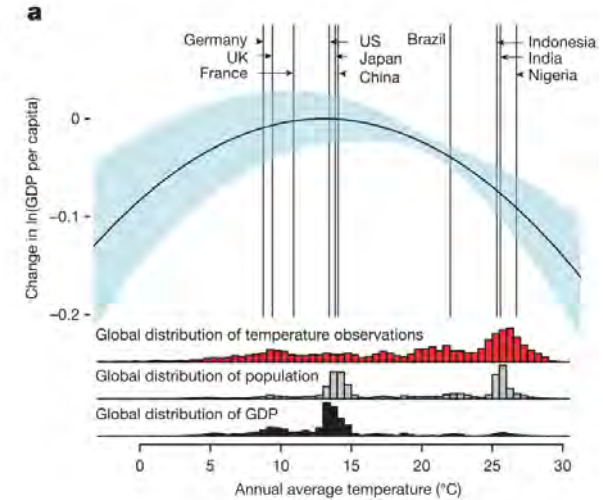


- Impact of climate and weather on economic outcome variables, namely GDP (Burke et al., 2015; Newell et al., 2021; Dell et al., 2012, Kalkuhl and Wenz, 2021)
- Climate change exacerbates **between-country** inequality (Diffenbaugh and Burke, 2019)
- Only few studies on within-country inequality (Vietnam (de Laubier Longuet Marx et al., 2019) and India (Sedova et al., 2019))
- Absolute poverty also likely to increase (Hallegatte and Rozenberg, 2017)
- Important: distinguish Weather and Climate (Tol 2021)



Conceptual framework

To investigate the climate impacts on economic productivity we typically look at GDP per capita growth (Burke et al. (2015))



- The inequality indices are typically bounded between 0 & 1
- We consider the absolute change of an index as dependent variable $\rightarrow \Delta y_{it} = \Delta Gini_{it}$
- Alternatively, we derive an *equality index* based on the Sen/Foster welfare function:

$$W = GDP_{pc}(1 - G)$$

- $\rightarrow \Delta y_{it} = \Delta \ln(1 - Gini_{it})$
- To compute the adjusted growth rate i of this equality index
- W can be derived by a Atkinson/rank utility function

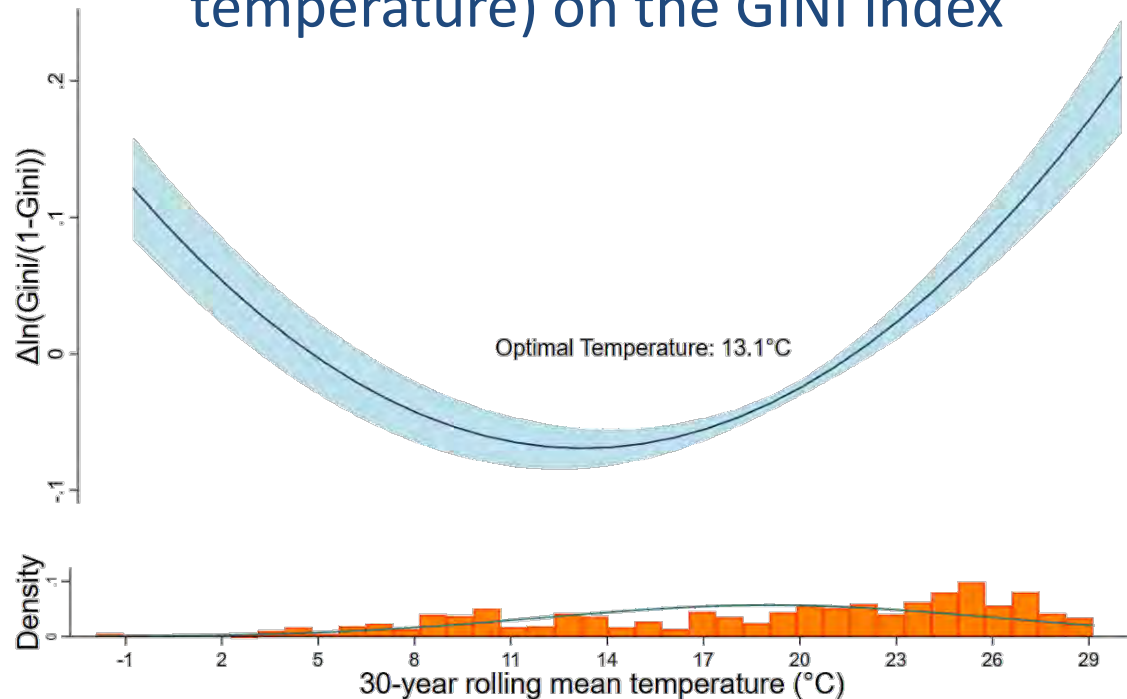
The inequality module – inclusion of impacts

- So far only mitigation

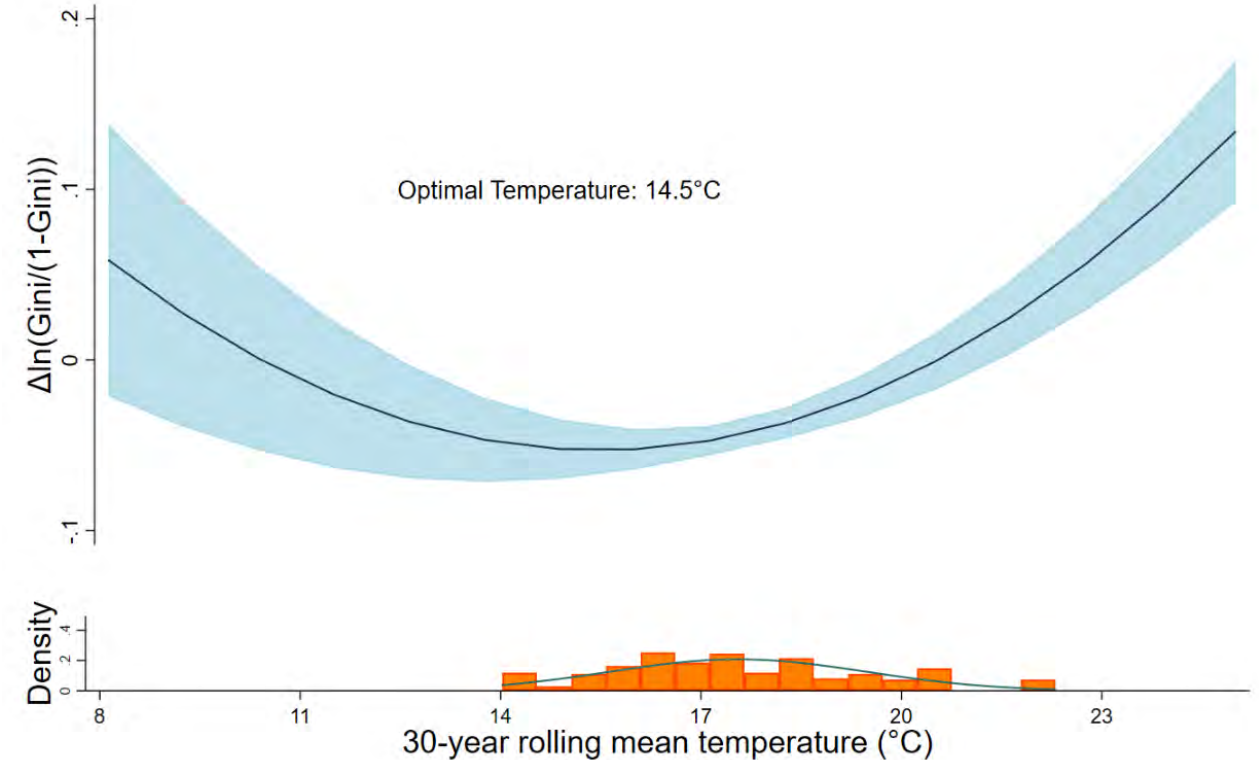
$$\Delta \log \left(\frac{Gini_{it}}{1 - Gini_{it}} \right) = \tau_1 T_{it} + \tau_2 T_{it}^2 + \beta \mathbf{X}_{it} + \alpha_i + \gamma_t + \epsilon_{it}$$

- Adding Impacts:

- Based on Climate econometric works
- Impact of climate (30year average of temperature) on the GINI index



Global (country level)



South Africa (district level)





- Version Control (Github etc.)!
 - Get to know commit, push, revert, checkout, branch, fork etc.
- Reproducible input data routine
 - Load raw or API data, reproducible aggregation manipulation etc.
- Modular code structure (by topic / feature / sector etc.)
 - See next slide for an example
- Quick and easy output evaluation / plotting

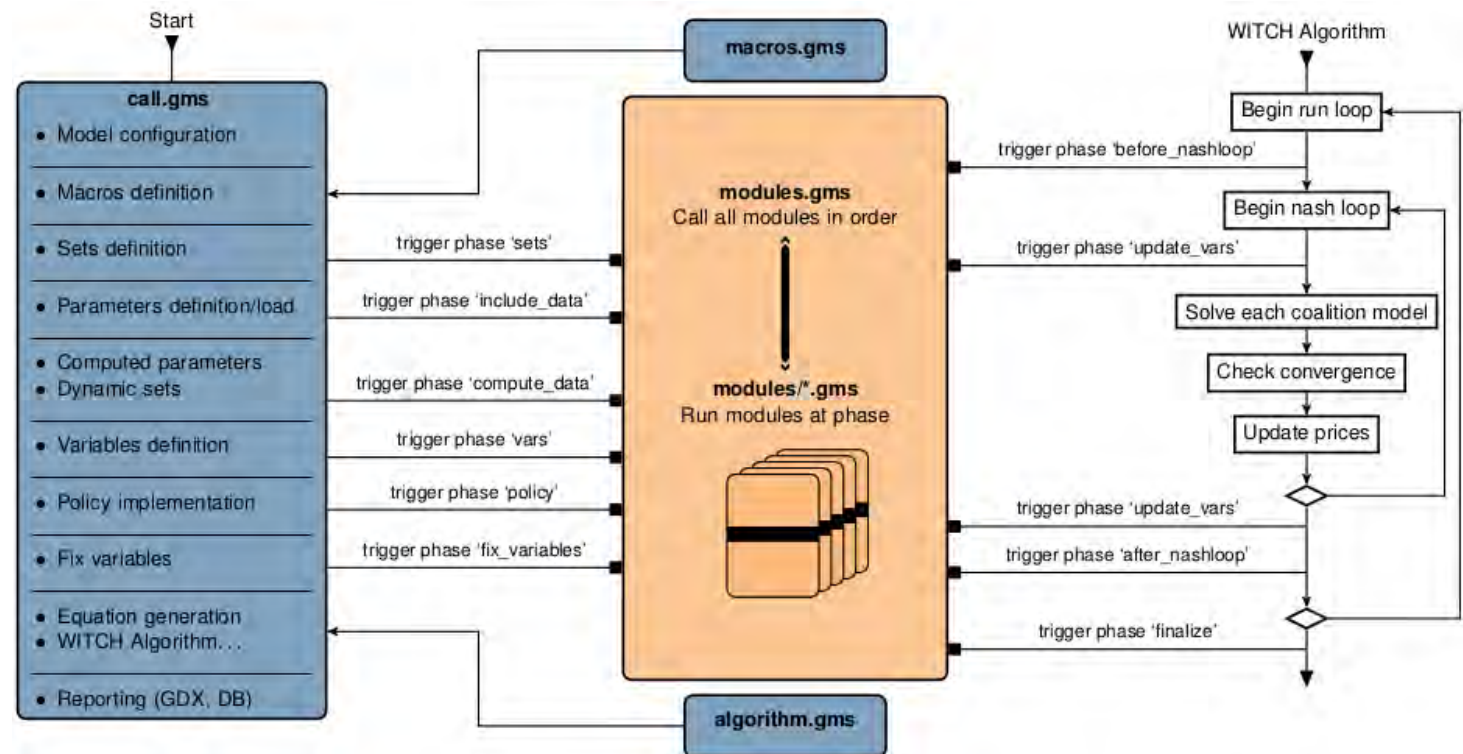


1. DICE: <https://williamnordhaus.com/dicerice-models>
2. GreenDICE: <https://github.com/BerBastien/GreenDICE>
3. GCAM: <https://github.com/JGCRI/gcam-core>
4. ReMIND: <https://github.com/remindmodel/remind>
5. MESSAGEix: https://github.com/iiasa/message_ix
6. WITCH: <https://github.com/witch-team/witchmodel>
7. RICE50x: <https://github.com/witch-team/RICE50xmodel>



Modular structure: the example of WITCH

- Algorithmic flow chart and module structure
 - **modules**: contain code relating to one technology or option or topic
 - **phases**: sequential structure in which the model is run (runs through each module in each phase)

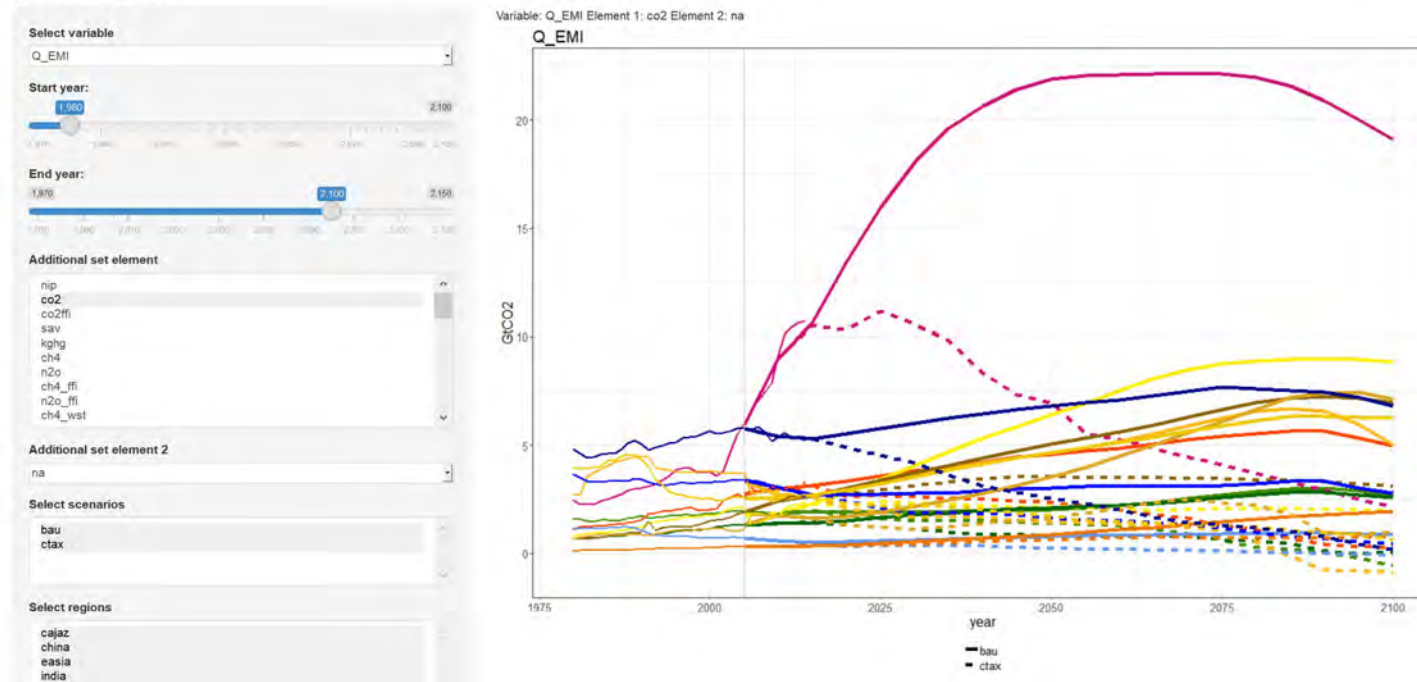


- Others: Mimi.jl framework (<https://www.mimiframework.org/>)

- Postprocessing and Figures

- Find your own way that works best for you

- Easy and Fast: GAMS IDE or Excel
- General and more complex: Python (Matplotlib) or R (tidyverse, ggplot2) or Matlab
- Fast and general: witch-plot repository on GitHub with many predefined functions and `gdxcomp`; `gdxcompaR`



- IAMC data format

	A	B	C	D	E	F	G	H	
1	Model	Scenario	Region	Variable	Unit	2005	2010	2015	
2	MESSAGE	CD-LINKS 400	World	Primary Energy	EJ/y	462.5	500.7	...	

- See Python packages pyam, openentrance and others
 - <https://pyam-iamc.readthedocs.io/en/stable/>
- IPCC databases: new and alternative models still required and invited to contribute, validation and vetting, etc. AR7....

Happy to discuss!

(And I am most certainly out of time)

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Thanks

