



# GREEN INVESTMENT AND PRODUCTIVITY: MAIN POLICY CHALLENGES

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# Introduction

- **Climate change** is increasingly recognized as a threat to global health and economic prosperity.
  - Achieving the 1.5°C scenario requires significant reductions in greenhouse gas emissions – that would need to be reduced by 45% by 2030 and reach net zero by 2050 – and **a transition to cleaner, renewable energy sources** (e.g., solar, wind, hydro), as well as **energy efficiency** measures, improved **energy storage**, and other low-carbon technologies.
- To do so, quickly scaling up global investment in technologies related to the energy transition is of substantial relevance.
  - **Annual investments in clean technologies** must quadruple to remain on with the 1.5°C scenario outlined in the Paris Agreement (CPI and IRENA 2023).
  - The latest IPCC synthesis report estimates that “investment requirements for 2020 to 2030 in scenarios that limit warming to 2°C or 1.5°C are a factor of three to six greater than current levels, and total mitigation investments [...] would need to increase across all sectors and regions” .

# Research goals

- Offer an overview of **green investment definitions** and **measurement** approaches.
  - ✓ Provide a measurable definition of green investment, building a database of **18 OECD countries over 2004-2020**.
- Test the effect of scaling up green investment and environmental regulation on **productivity**.
  - ✓ Expected outcomes:
    1. **Positive productivity** gains from green investment because of **green capital deepening**
    2. Stricter environmental regulations leads to positive productivity returns through innovation (**Porter hypothesis**)

# Background literature

- There is not yet a unique definition of what can be included in the boundaries of **green investment**, most of the studies looked at different categories of expenditures/items potentially considered as green investments.
- Story 1) **The relation between green investment, production, productivity, and firms' performances**

- **Macro analysis:** Few studies. Batini et al. (2022) estimated that multipliers associated with green capital spending on power generation using renewable sources are about 2 to 7 times larger than those associated with 'non-eco-friendly' expenditure
- **Micro analysis:** Wide (but not unanimous) consensus about the positive productivity returns of scaling up green investments at the firm level

- Story 2) **The relation between environmental regulation and productivity**

## Porter hypothesis

- **Stricter environmental regulation** could lead to positive productivity returns through **innovation**
- We expect that tighter environmental policies might encourage innovations that more than offset the costs associated with complying with regulations, leading to a positive effect on productivity growth (Porter and van der Linde 1995, De Santis et al. 2021).

# DEFINING AND MEASURING GREEN INVESTMENT

# Defining and measuring green investment

- At present, there are several definitions of green investment without any clear indication from the Official Statistics about what type of assets can be classified as such.
  - ✓ Opinions differ on the extent to which different asset classes can be classified as green as, more generally, there is no clarity around the appropriate metric for 'greenness'.
- Inderst et al. (2012) provide a comprehensive review of concepts and definitions related to green investments examining them in **different areas** (macroeconomic level, green goods and services, foreign direct investments, patents) and **asset classes** (stocks, bonds, and alternative investments)
  - ✓ They conclude that it is unlikely that an agreement can be found on an all-encompassing and exact operational definition of what can be classified as green.

# Green investment: a definition

- The UN Environment Programme (2011) proposes a broad definition of **green investment** starting from the concept of ‘green economy’, defined as one that results in improved human well-being and social equity, and that can significantly reduce environmental risks and ecological scarcities.
- **Green investment** could be defined as the sum of any expenditures in **abatement technologies**, including (but not limited to) investment in renewable **energy and resource efficiency** (manufacturing, waste, buildings, transport, and cities), in **natural capital** (agriculture, fisheries, water resources, forests), and in **digital technologies** aimed at reducing the carbon intensity of production processes.
  - Over the years, green investment has also been used as an **umbrella term** including all investments targeting environmental improvements.
  - Often use as interchangeable with concepts like sustainable and responsible investment, socially responsible investment, or environmental, social, and corporate governance (ESG) investment.

# Green investment through macroeconomic lenses

- Eyraud et al. (2013) provide a **measurable definition** of green investment at the macroeconomic level
- Green investments are those needed for reducing greenhouse gas and air pollutant emissions without significantly reducing the production and consumption of non-energy goods.
- They identify three main investment components for being classified as green:
  - a. Low-emission energy supply**, which refers to investment that involves shifting energy supply from fossil fuels to less polluting alternatives;
  - b. Energy efficiency**, that includes technologies reducing the amount of energy required to provide goods and services;
  - c. Carbon sequestration**, that involves halting ongoing deforestation, reforestation, and sequestering more carbon in soils through new agricultural practices.

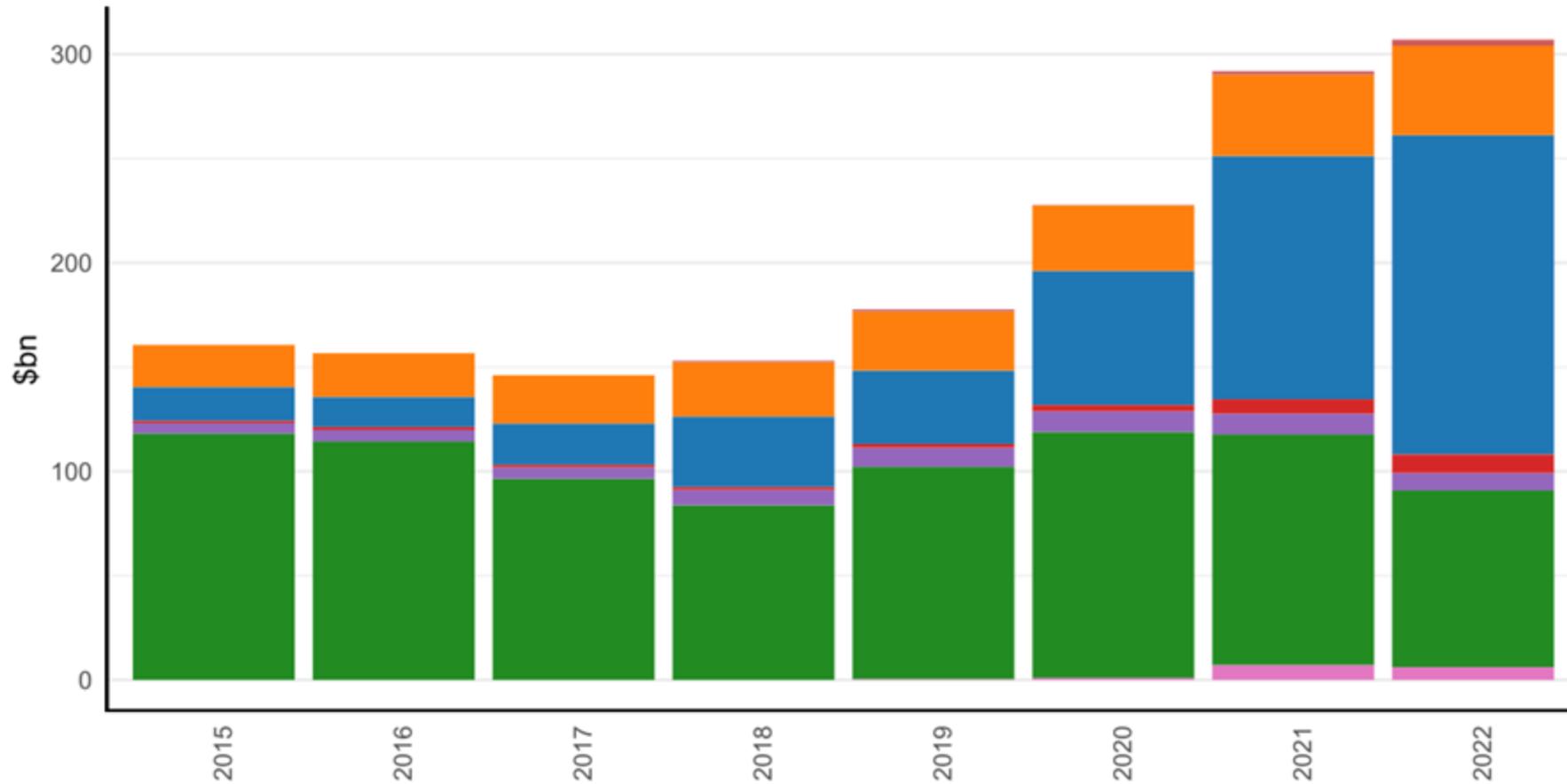
# Macroeconomic measurement of green investment

Definition	Indicator	Source
Green investment ( <a href="#">Eyraud et al., 2013</a> )	Financial investment in renewables	BloombergNEF
	Energy efficiency investments	BloombergNEF
	Corporate and government R&D	BloombergNEF
Climate change mitigation investment ( <a href="#">EIB, 2023</a> )	Investment in energy efficiency - estimates	IEA
	Total investment in renewable energy	IEA
	Transport investments (rail and inland waterways)	OECD ITF
	Gross fixed capital formation (GFCF) in forestry	Eurostat and BEA
Green spending ( <a href="#">Batini et al., 2022</a> )	R&D investment in low-carbon technologies	JRC-SETIS, IEA, IMF, OECD
	IEA estimates of capital spending on power generation using renewable energy	IEA
	Overnight construction cost - clean non-renewable energy (nuclear energy)	OECD's Nuclear Energy Agency, IAEA
Climate investment ( <a href="#">CPI, 2022</a> ; <a href="#">CPI and IRENA, 2023</a> )	Annual investments in renewable energy	CPI, IEA, BloombergNEF

# Capturing green investment

- Data on green investment are taken from [BloombergNEF](#), providing an indicator of energy transition expenditures covering investment in the following areas:
  - ✓ **Renewable energy:** wind (on- and offshore), solar (large- and small-scale), biofuels, biomass & waste, marine, geothermal and small hydro;
  - ✓ **Energy storage:** stationary storage projects (large- and small- scale), excluding pumped hydro, compressed air and hydrogen. The majority are battery projects;
  - ✓ **Nuclear power:** reactors under construction and major refurbishments;
  - ✓ **Hydrogen:** hydrogen electrolyzer projects, thermochemical hydrogen production, pipelines and underground storage;
  - ✓ **Carbon capture and storage (CCS):** large- and small-scale commercial CCS projects, dedicated transport and storage;
  - ✓ **Electrified transport:** sales of electric cars, commercial vehicles and buses, as well as home and public charging investments. Hydrogen fuel cell vehicles and refuelling stations are also included in this category;
  - ✓ **Electrified heat:** residential heat pump investments;
  - ✓ **Sustainable materials:** circular economy (recycling) and bioplastics.

# Green investment, 2015-2022, total, G7 countries

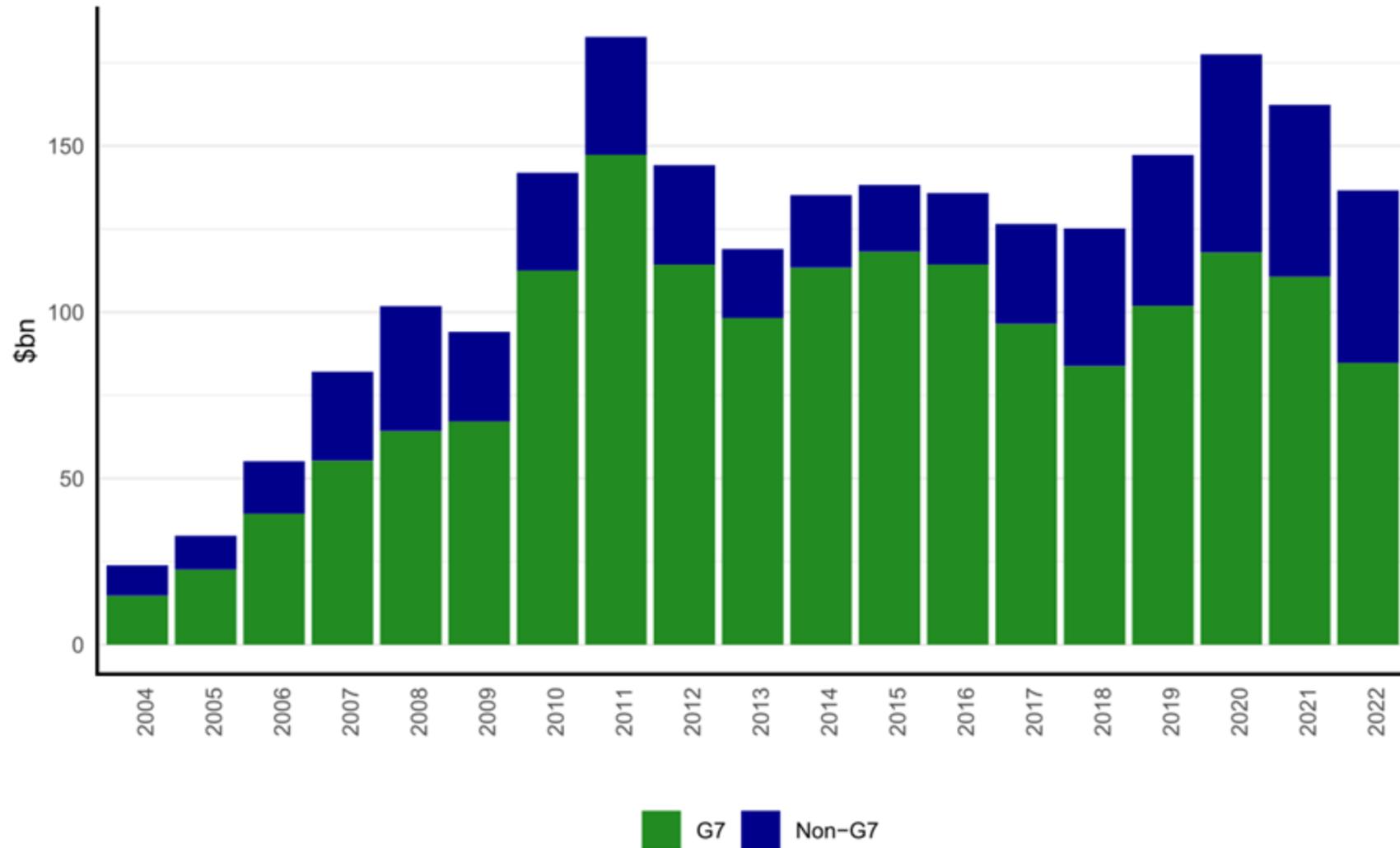


## Caveat:

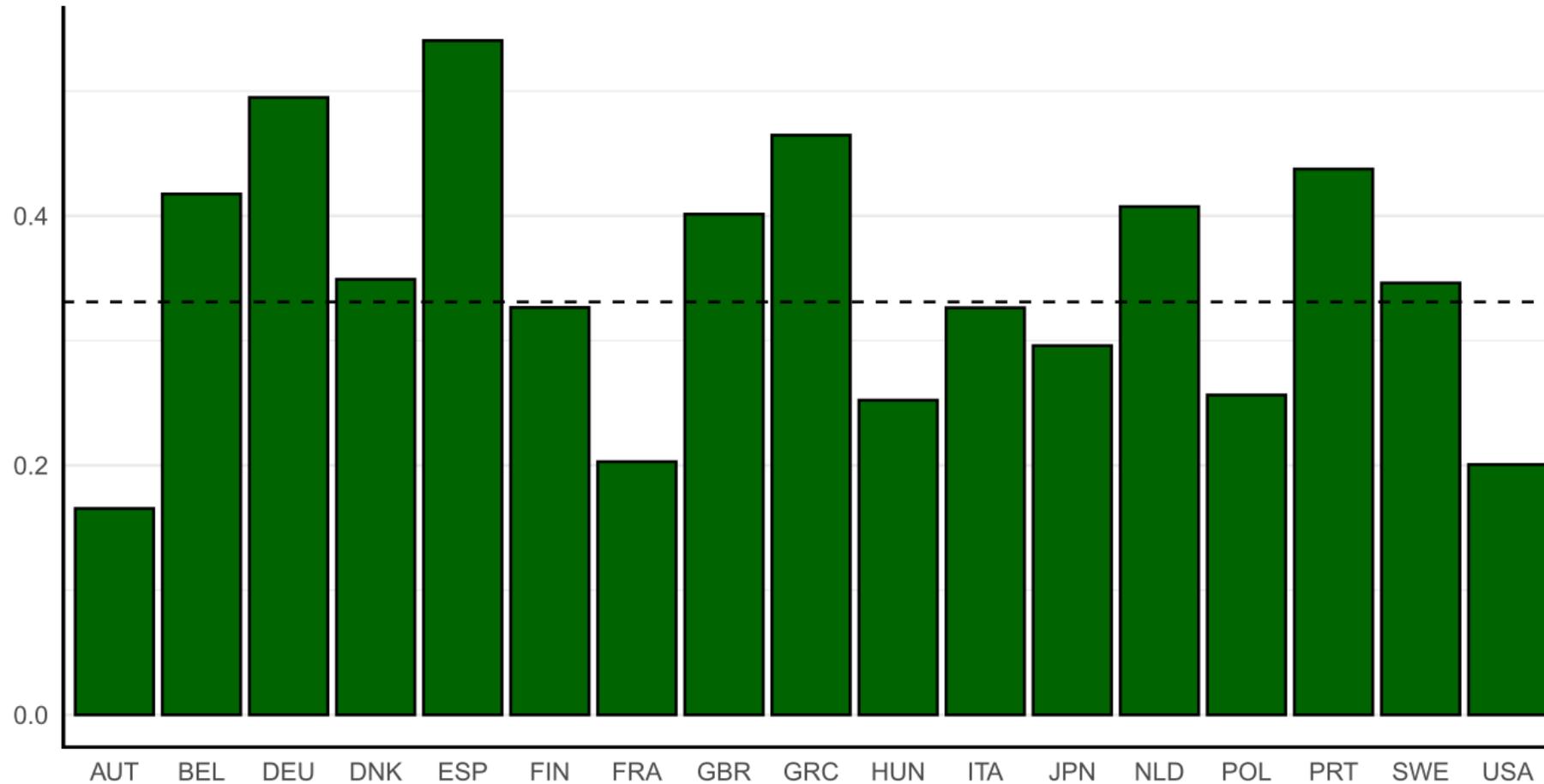
- Data on green investment by area are available at annual frequency only after 2015
- The empirical analysis focuses more specifically on **renewable green investment** because of better data availability (2004-2023, annual)



# Renewable green investment, 2004-2022

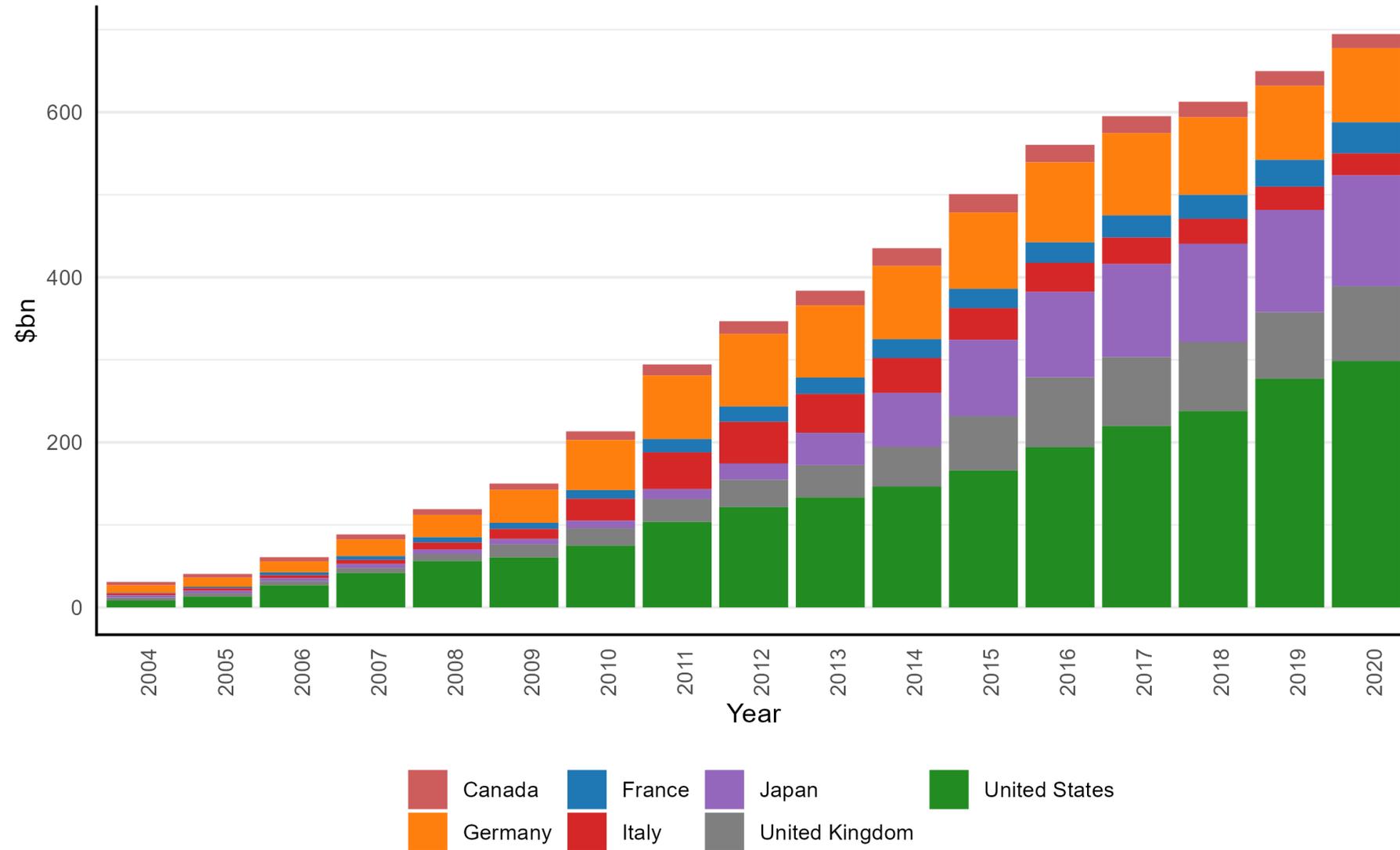


# Renewable green investment (per Gross Value Added), by country, 2004-2020 averages



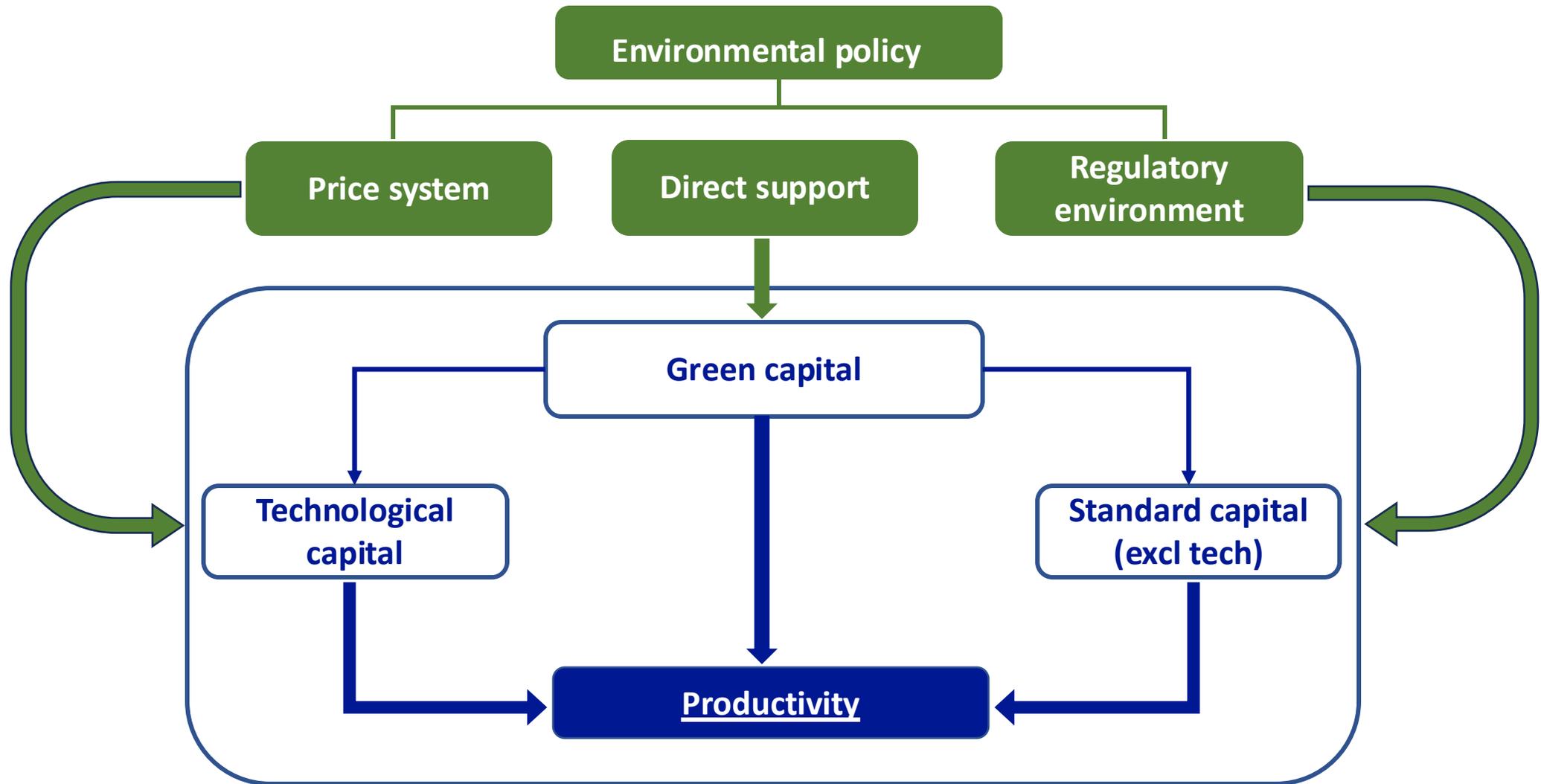
-- 2004-2020 avg.

# Renewable green capital in G7 countries, 2004-2020



GREEN INVESTMENT, PRODUCTIVITY, AND  
ENVIRONMENTAL POLICY STRINGENCY

# Conceptual framework



# Construction of the dataset

- The dataset used in this paper covers 18 OECD countries for the period 2004-2020.
- It encompasses annual data on:
  - Green investment
  - Green capital
  - Capital formation
  - Hours worked
  - Labor productivity
  - Stringency of environmental policies
- The database includes the following countries:  
Austria, Belgium, Germany, Denmark, Greece, Spain, Finland, France, Hungary, Italy, Japan, Netherlands, Poland, Portugal, Sweden, United Kingdom, United States

# Other data sources: productivity, labor and capital inputs

- The renewable green investment data from BloombergNEF are then integrated with input and output variables from the EUKLEMS & INTANProd providing data for productivity analysis.
- The database consists of two modules: statistical and analytical.
- We resort to the statistical module containing all the key variables for industry-level productivity accounting gathered directly from the national accounts of individual countries.
  - We collect data on Gross Value Added (GVA) and hours worked to compute a labor productivity indicator as GVA per hour worked.
  - We use the capital accounts in the statistical module to retrieve data capital stocks by asset for OECD member countries – including few OECD members not part of the European Union (namely, United Kingdom, United States, and Japan).
  - Data are expressed in real terms – at 2015 prices – and then standardized by hours worked.

# Data description

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Variable	Description	Source
$y$	Labor productivity – GDP per hour worked	EUKLEMS & INTANProd
$k$	Capital intensity – Capital per hour worked	EUKLEMS & INTANProd
$k_{green}$	Renewable green capital per hour worked	BloombergNEF, EUKLEMS & INTANProd
$green_{int}$	Green skills intensity	<a href="#">Bontadini et al. (2024)</a>
$EPS$	Environmental policy stringency index - total	OECD
$EPS_{MKT}$	Environmental policy stringency index - market policies	OECD
$EPS_{NMKT}$	Environmental policy stringency index - non-market policies	OECD
$TECHSUP$	Environmental policy stringency index - technology support	OECD

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# Summary statistics

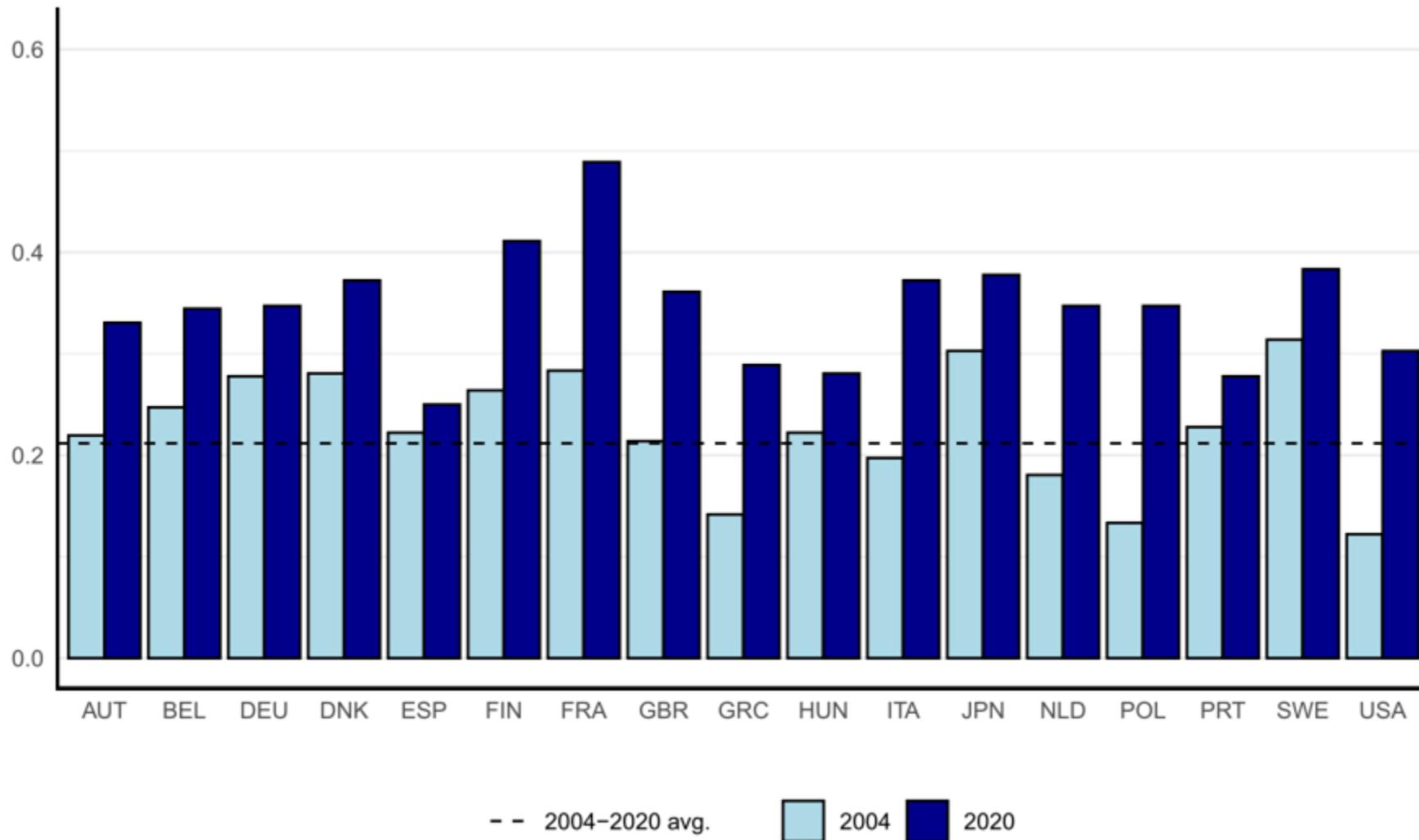
Variable	Obs	Mean	Std. Dev.	Min	Max
$\Delta \ln(y)$	271	0.008	0.018	-0.079	0.064
$\Delta \ln(k_t)$	271	0.01	0.029	-0.102	0.119
$\Delta \ln(k_{green,t})$	287	0.207	0.375	-0.154	4.371
$green_{int}$	135	0.024	0.003	0.02	0.033
$EPS$	306	0.304	0.061	0.122	0.489
$EPS_{MKT}$	306	0.161	0.094	0.017	0.417
$EPS_{NMKT}$	306	0.506	0.068	0.2	0.6
$TECHSUP$	306	0.246	0.122	0	0.6

**Source:** authors' elaboration on OECD.Stat, EUKLEMS & INTANProd

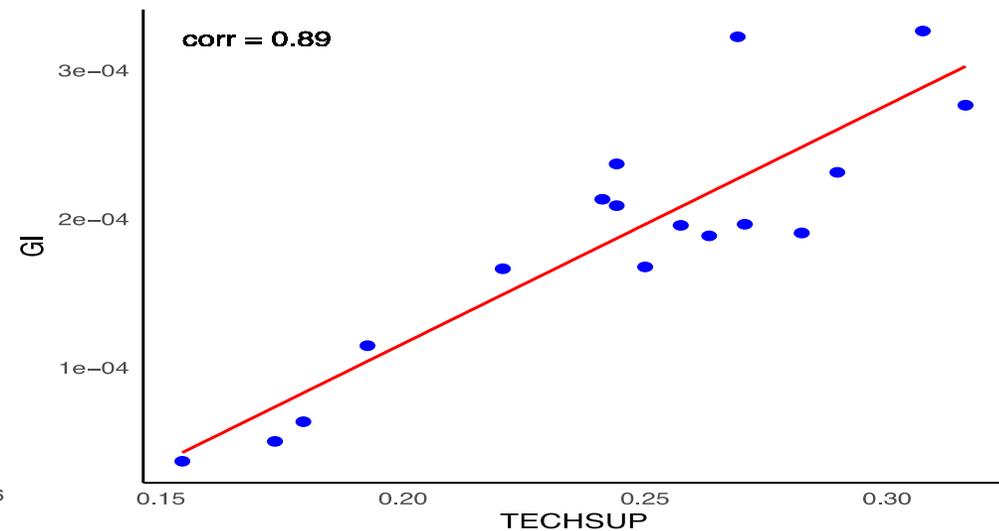
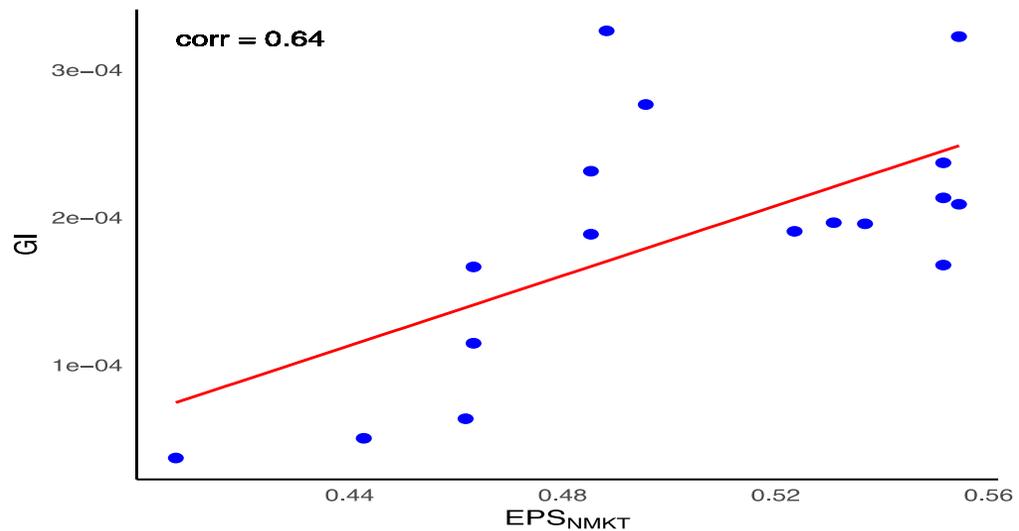
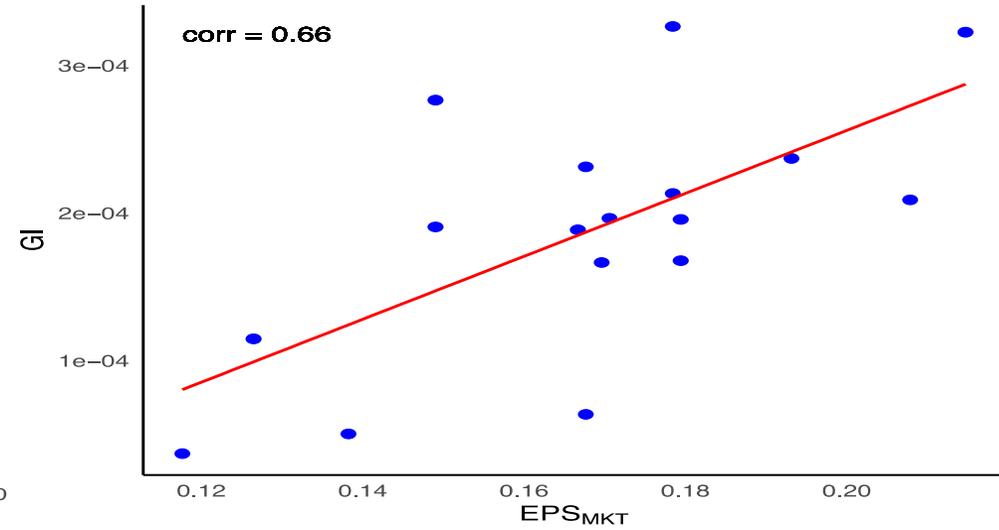
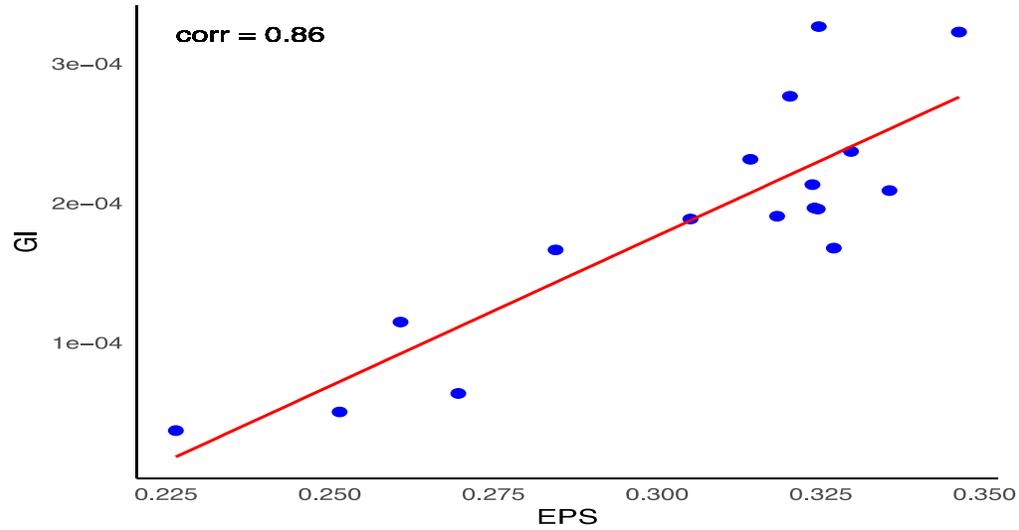
# Environmental Policy Stringency

- The OECD Environmental Policy Stringency Index (EPS) is a country-specific and internationally comparable measure of the stringency of environmental policy, developed for the OECD countries by on the basis of the taxonomy of . The index was recently updated by .
- The level of stringency in environmental regulation refers to how much polluting or environmentally detrimental behavior is penalized, either explicitly or implicitly.
- The aggregate EPS index consists of three equally-weighted sub-indices, ranging between **0** (not stringent) and **0.6** (highest stringency) and measuring the stringency of:
  - **Market based policies**, such as taxes, permits, trading schemes, and certificates;
  - **Non-market based policies**, such as those that mandate emission limits and performance standards;
  - **Technology Support policies**, encompassing those policies that support innovation in clean technologies and their adoption, e.g. R&D support, feed-in tariffs, auctions.

# Economic policy stringency by country, total index, 2004-2020



# Renewable green investment and environmental policy stringency, averages by time, 2004-2020



# Model specification

**We econometrically test this relationship in a production function model augmented with green investment and EPS**

The general specification of the model is as follows:

$$\Delta y_{i,t} = \beta_0 + \sum_{c=1}^C \beta_C \Delta x_{i,t}^C + \sum_{d=1}^D \beta_D x_{i,t}^D + \sum_{e=1}^E \beta_E X_{i,t}^E + \gamma_t + \eta_i + \epsilon_{i,t}$$

where  $i = \text{country}$  and  $t = \text{time}$ .  $x_{i,t}^C$  is the vector of covariates (in log differences),  $x_{i,t}^D$  is the vector of covariates in levels,  $X_{i,t}^E$  are the control variables (when applicable, intangible assets),  $\eta_i$  represents the country-specific fixed effects and  $\gamma_t$  captures the time-specific fixed effects.

# Regression results

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)
	GLS	GMM	GLS	GMM	GLS	GLS	GLS	GLS	GLS
Variables									
$\Delta \ln(k)$	0.422*** (0.0387)	0.353*** (0.128)	0.414*** (0.0379)	0.418*** (0.121)	0.412*** (0.0381)	0.416*** (0.0378)	0.419*** (0.0377)	0.409*** (0.0401)	0.481*** (0.0573)
$\Delta \ln(k_{Green})$			0.00773*** (0.00214)	0.00971* (0.00511)	0.00774*** (0.00214)	0.00731*** (0.00216)	0.00764*** (0.00213)	0.00763*** (0.00217)	0.0192*** (0.00524)
$\ln(EPS)$					0.00467 (0.00800)				
$\ln(EPS_{MKT})$						-0.00416 (0.00331)			
$\ln(EPS_{NMKT})$							0.0169** (0.00840)		0.0304** (0.0127)
$\ln(TECHSUP)$								2.45e-05 (0.00203)	
$\ln green_{int} \times \ln(k_{Green})$									0.0987*** (0.0356)
<b>Observations</b>	271	238	271	238	271	271	271	268	112

Note: Annual data; Standard errors in parentheses;

\*\*\* p<0.01, \*\* p<0.05, \* p<0.1

# Empirical findings (so far)

- Our findings show that, albeit small, scaling up **renewable green capital** has a positive and significant effect on productivity growth
  - Difference between estimation results using different methods suggest that  $k_{green}$  might be affected by a downward endogeneity bias.
- The results suggest that strengthening environmental regulation does not hamper productivity growth.
  - **Market policies**, e.g. carbon taxes and trading schemes, could lead to productivity effects that, however, are not statistically significant.
  - At the same time, **non-market policies** – such as emission limits – appear to be the most effective in fostering innovation in our sample.
  - Last, the stringency associated with **technology support measures** has a positive but not significant impact on productivity growth.
    - ✓ However, one might notice that the sub-index groups together two sets of policies which have arguably different effects (Becker 2015), i.e. public R&D expenditures on low-carbon energy technology and renewable energy support measures.
- When interacted with renewable green capital, **green skill intensity** has a positive and statistically significant impact on productivity

# POLICY DISCUSSION

# Policy discussion 1/2

- It's important to look at how to **further improve green investment measurements** to provide data and instruments that allow a better policy evaluation of the **green transition** and better define **environmental mitigation strategies**
- The empirical analysis conducted suggests some potential **policy issues** that might be worth further developing:
  - an increase in **renewable green capital** leads to positive and significant effects on **productivity growth**;
  - there **may not necessarily be a trade-off** between climate change mitigation objectives and economic growth;
  - potential **synergies** may exist between the two goals: governments may decide to pursue climate change mitigation objectives and spur productivity growth at the same time.

# Policy discussion 2/2

The results of our analysis suggest a deeper exploration of the following preliminary findings:

- **more stringent environmental regulatory measures** may have a **potential positive role** to play: stricter regulation does not necessarily constrain productivity growth and might even stimulate innovation thus favoring adaptation
- we found that **non-market policies** appear to be the most effective in **fostering innovation and likely productivity**;
- policymakers should also consider the potential positive role of **green technology support measures**.

Overall, scaling public investment alone is not enough: to fulfill climate ambitions, policymakers has a role to play also in **mobilizing private capital** and creating favorable conditions for private investment (*Deleidi et al., 2020*).

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