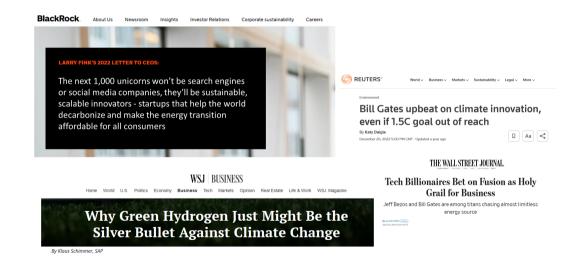
## The CO2 Question: Technical Progress and the Climate Crisis

#### Patrick Bolton, Marcin Kacperczyk & Moritz Wiedemann<sup>1</sup>

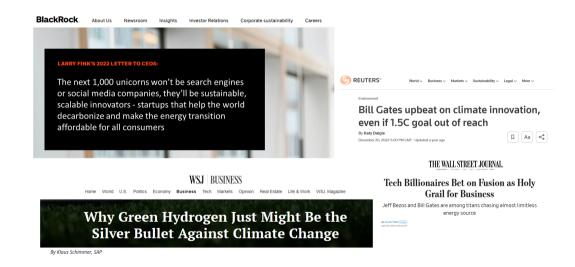
<sup>1</sup>Rotterdam School of Management, Erasmus University

7th Annual GRASFI Conference at SMU September 4, 2024

#### Green innovation is the silver bullet.



## Green innovation is the silver bullet?



#### Two views on the role of green innovation on emissions



#### Allows for emission reductions

- Brown firms change from carbon-intensive production to renewable production
- Brown firms improve efficiency of their fossil fuel use
- ▶ e.g. Aghion et al. (2016)

#### Does not allow for emission reductions

- Jevons (1865) paradox: Efficiency increases, but higher consumption dominates any efficiency gain
- Arrow: Replacement effect (1962) & Economics of learning-by-doing (1971) drive path dependency
- Displacement effect: Emissions spill over to other parts of the production network



What is the impact of green innovation on future corporate emissions?
 ⇒ More green innovation does not allow for emission reductions

- What are possible underlying economic mechanisms?
  - $\Rightarrow$  Path dependency in the production of innovation
  - $\Rightarrow$  The role of the Jevons paradox
  - $\Rightarrow \mathsf{Emission} \ \mathsf{displacements}$





## Data and setting



What is the impact of green innovation on future corporate emissions?



What are possible underlying economic mechanisms?

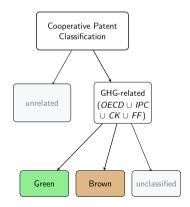


#### Carbon emission data from S&P Global Trucost

- ▶ Public firm scope 1, scope 2 and scope 3 CO2 equivalent emission data
- Coverage: 2005 to 2022
- Patent data from Orbis Intellectual Property
  - Global patent data for public and private firms
  - Focus on patents granted by the European Patent Office (EPO) including later patent purchases
- **③** Financial information from Orbis, Compustat, FactSet and Worldscope



- Pool greenhouse gas related classifications from 4 sources: OECD Env-tech; IPC Green Inventory; Fossil fuels (FF) efficiency improving classes by Lanzi et al. (2011); & a self classification based on Corporate Knights Clean 200 companies (CK)
- Split greenhouse gas related classifications in 2 types:
  - Green: Technologies that substitute/ enable the substitution of carbon dioxide emitting technologies for carbon dioxide-free technologies
  - Brown: Technologies that improve process efficiencies of fossil fuel sources and thus reduce carbon dioxide emissions per output



#### Green patent example

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Register >  Applicants Inventors	Global Dossier ,7 BRIDGESTONE CORP [JP] + TINO YASUHIRO [JP]; OTANI KAORU [JP]; TAKANO KAZUYA [JP] +		• < >
Classifications IPC CPC	832827/08; 832827/28; H01L31/04; H01L31/048; H01L31/042; 832817/10788 (IFPUS): 832827/08 (IFPUS): 832827/28 (IFPUS): 832827/28	OECD Env-tech: 2.1.3. Solar photovoltaic (PV) energy	FIG. 1
Priorities Application Publication	B3282331494 (UB); B328239709 (UB); B328249712 (UB); <mark>1792E16569 (EP);</mark> JP10035598A 1999-94-07, JP9908726W 1999-12-01 EP99957398A 1999-12-01 EP118271085 2006-05-21	YVITABOISE (EPUE), YVITABOISEE (EPUE), YVITABOIROE (EPUE), YVITABOITOR (EPUE),	20. ]2 3 4
Published as	DE69932098T2; EP1182710A1; EP1182710A4; EP1182710B1; JP200929481	;; U56407329D1; W00062348A1	
Abstract Abstract not available A backside cover deposited on a su between a front s and sealing film v	urface of said base film. A backside covering and sealing film is made by integrally side transparent protective member (8) and the aforementioned backside covering	and a mosthersport from (2) with SNN advectors (4). The mosthersport film (2) is constituted of a base film and a costing layer of an integrate anote emontrol to the domensificated basicities on overang memory (2) and a SNN film (3) signifier A start barliery (13) in male by praining source calls (7) enter (1) as a basic barlier anotem, The prained memory barliers barliers (2) and the barlier (2) and basic barliers and barliers (2) and the barlier (2) and basic barliers and barliers (2) and basic barliers (2) and	FIG. 2

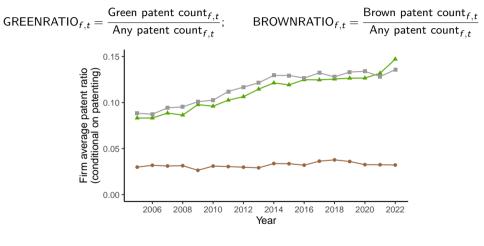


#### Brown patent example

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Register > 0	Global Dossier A				e	( <b>X</b>
Applicants	JOHNSON MATTHEY PLC (GB) +				_	
Inventors	CHANDLER OUY RICHARD [GB]; FLANAGAN KEITH DIRK [GB] +	ANTHONY (GB); PHILLIPS PAUL RICHARD	(OB): SCHOFIELD PAUL (OB): SPENCER MICHAEL LEONARD WILLIAM (OB): STRUTT HEDLEY MICHAEL (OB); AI	DERHOLD		69 1 601 000 M
Classifications IPC	A44B13/00; 801J37/02; 801J37/04; 805D7/22; 8298	11/04; F01N3/20;	OECD Env-tech: 1.1.2. Emissions abatement from mobile sources (e.g. NOx, CO, HC, PM emissions from motor vehicles)			N N N N N N N N N N N N N N N N N N N
CPC	A44B13/0011 (EP,KR,US); B01D53/00 (GB); B01D53/ B01J37/0215 (GB); B01J37/0246 (US); B05C9/02 (GE F01N3/105 (GB); F01N3/20 (GB,KR); F01N3/2066 (GE	3,KR); 805C9/04 (KR); 805C9/045 (KR); 80	KR,US); B91J2108 (US); B01J27224 (US); B01J20763 (US); B01J303 (KR); B01J3504 (US); B01J3702 (KR); S0108 (GB); B8501082 (GB); B850580 (GB); B850722 (GB,KR); B850724 (GB); F01N3035 (GB); F01N308 (K ); B856982 (US); B856804 (US); B8569045 (US);	R);		
Priorities	GB201000019A-2010-01-04; GB2011050005W-2011-0	1-04				18 -20
Application	EP11702492A-2011-01-04					
Publication	EP2521618B1 2013-08-28					195.1
Published as	EP2889083A1; GB2477602A; GB2477602A8; GB2477	7602B; GB2477602B8; GB2487847A; GB24 A; MY15995JA; PL2521618T3; RU2012133	HIDDAHDA I, DKISZIELI TZ, EPSZIELIA I, <mark>PSZIELIE P</mark> ZEPIELIE PSZIELIE PSZIEDI K PZZIELI PZZIEDI K PSZIEDI K PZZIE EPZZIAZ, ODZATYATE, ODZATYATELI IKI TYMADA I, JPRI SIEKOVA, JPRI SIEKOWA, I PSZIEDI K JPRI SIEKOWA I SIAN, RUDHI SIEMIA, RUDHI SIEKOVA, RUDHI SIEKOVA, RUDHI SIEKOVA, I VZIELIE RUDHI SIEKOVA I SIAN, RUDHI SIEMIA, RUDHI SIEKOVA, RUDHI SIEKOVA, RUDHI SIEKOVA, I VZIELI RUDHI SIEKOVA, I VZIELI RUDZI Z Z Z			64 - 10 64 - 10
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Abstract						
	le for EP252161881 – abatract of corresponding document: WO201					18 24
determined volum		mels at a lower end of the substrate; (iii) sea	It component comprises the steps of: (i) holding a honeycomb monolith substrate substantially vertically; (i) hitroducing ingay relaining the introduced liquid within the substrate; (iv) inverting the substrate containing the relained liquid; and (iv the channels of the substrate.			PRG 3



#### Patent ratio, as innovation measure, to focus on relative attention



Patent type 🔶 brown 📥 green 💷 OECD env-tech









What is the impact of green innovation on future corporate emissions?



What are possible underlying economic mechanisms?



## Does green/ brown innovation allow for emission reductions?

	$(1) \\ LOGS1TOT_{t:t+2}$	$(2) \\ LOGS2TOT_{t:t+2}$	$(3) \\ LOGS3UPTOT_{t:t+2}$	(3) LOGS3DOWNTOT <sub>t:t+</sub>
Panel A: Green innovati	on			
$GREENRATIO_{f,t-3:t-1}$	0.004	0.022	0.013	-0.031
	(0.035)	(0.036)	(0.017)	(0.082)
R2 Full Model	0.967	0.967	0.985	0.953
R2 Reduced Model	0.967	0.967	0.985	0.953
Partial R2 (×10e-5)	0.00864	0.364	0.281	0.139
Observations	39159	39159	39159	21521
Panel B: Brown innovati	ion			
BROWNRATIO <sub>f,t-3:t-1</sub>	0.109*	-0.016	0.025	0.234
	(0.059)	(0.065)	(0.029)	(0.168)
R2 Full Model	0.967	0.967	0.985	0.953
R2 Reduced Model	0.967	0.967	0.985	0.953
Partial R2 (x10e-5)	1.947	0.0627	0.311	2.078
	1.947 39159	0.0627 39159	0.311 39159	2.078 21521
Partial R2 (x10e-5) Observations Controls				
Observations	39159	39159	39159	21521

 $y_{f,t:t+2} = \beta_0 + \beta_1 Patent Ratio_{f,t-3:t-1} + \Omega Controls_{f,t-3:t-1} + \Gamma_f + \Gamma_{j \times t} + \varepsilon_{f,t}$ 

Controls include: LOGSIZE, LOGPPE, LEVERAGE, ROE, M/B, INVEST/A, LOGASSETS, LOGAGE, BETA, VOLAT, RET, and MSCI. Standard errors are double clustered at firm and year dimension.

### How large is the explanatory power of green/brown innovation?

	$(1) \\ LOGS1TOT_{t:t+2}$	$(2) \\ LOGS2TOT_{t:t+2}$	$(3) \\ LOGS3UPTOT_{t:t+2}$	(3) LOGS3DOWNTOT <sub>t:t+2</sub>
Panel A: Green innovati	on			
$GREENRATIO_{f,t-3:t-1}$	0.004	0.022	0.013	-0.031
	(0.035)	(0.036)	(0.017)	(0.082)
R2 Full Model	0.967	0.967	0.985	0.953
R2 Reduced Model	0.967	0.967	0.985	0.953
Partial R2 (x10e-5)	0.00864	0.364	0.281	0.139
Observations	39159	39159	39159	21521
Danal P. Proven innovat				
	ion 0.109* (0.059)	-0.016 (0.065)	0.025 (0.029)	0.234 (0.168)
BROWNRATIO <sub>f,t-3:t-1</sub>	0.109*			
BROWNRATIO <sub>f,t-3:t-1</sub> R2 Full Model	0.109* (0.059)	(0.065)	(0.029)	(0.168)
Panel B: Brown innovat BROWNRATIO <sub>f,t-3:t-1</sub> R2 Full Model R2 Reduced Model Partial R2 (x10e-5)	0.109* (0.059) 0.967	(0.065) 0.967	(0.029) 0.985	(0.168)
BROWNRATIO <sub>f,t-3:t-1</sub> R2 Full Model R2 Reduced Model Partial R2 (x10e-5)	0.109* (0.059) 0.967 0.967	(0.065) 0.967 0.967	(0.029) 0.985 0.985	(0.168) 0.953 0.953
BROWNRATIO <sub>f,t-3:t-1</sub> R2 Full Model R2 Reduced Model	0.109* (0.059) 0.967 0.967 1.947	(0.065) 0.967 0.967 0.0627	(0.029) 0.985 0.985 0.311	(0.168) 0.953 0.953 2.078
BROWNRATIO <sub>f,t-3:t-1</sub> R2 Full Model R2 Reduced Model Partial R2 (x10e-5) Observations	0.109* (0.059) 0.967 0.967 1.947 39159	(0.065) 0.967 0.967 0.0627 39159	(0.029) 0.985 0.985 0.311 39159	(0.168) 0.953 0.953 2.078 21521

 $y_{f,t:t+2} = \beta_0 + \beta_1 Patent Ratio_{f,t-3:t-1} + \Omega Controls_{f,t-3:t-1} + \Gamma_f + \Gamma_{j \times t} + \varepsilon_{f,t}$ 

Controls include: LOGSIZE, LOGPPE, LEVERAGE, ROE, M/B, INVEST/A, LOGASSETS, LOGAGE, BETA, VOLAT, RET, and MSCI. Standard errors are double clustered at firm and year dimension.





#### Data and setting



What is the impact of green innovation on future corporate emissions?



What are possible underlying economic mechanisms?



# [1] Increase in sales and improvements in emission intensity in line with the Jevons Paradox

 $y_{f,t:t+2} = \beta_0 + \beta_1 \mathsf{BROWNRATIO}_{f,t-3:t-1} + \Omega Controls_{f,t-3:t-1} + \Gamma_f + \Gamma_{j \times t} + \varepsilon_{f,t}$ 

	(1) $S1INT_{t:t+2}$	(2) S2INT $_{t:t+2}$	$(3) \\ S3UPINT_{t:t+2}$	(4) S3DOWNINT <sub>t:t+2</sub>	(5) $LOGSALES_{t:t+2}$	(6) $LOGCAPEX_{t:t+2}$
$BROWNRATIO_{f,t-3:t-1}$	-0.073	-0.059**	$-0.142^{***}$	-0.155	0.067***	0.138**
	(0.245)	(0.026)	(0.046)	(1.232)	(0.021)	(0.057)
Observations	39159	39159	39159	21521	39159	39068
R2	0.940	0.865	0.938	0.903	0.984	0.954
Controls	yes	yes	yes	yes	yes	yes
Industry-Year F.E.	yes	yes	yes	yes	yes	yes
Firm F.E.	yes	yes	yes	yes	yes	yes

Controls include: LOGSIZE, LOGPPE, LEVERAGE, ROE, M/B, INVEST/A, LOGASSETS, LOGAGE, BETA, VOLAT, RET, and MSCI. Standard errors are double clustered at firm and year dimension.



 $y_{f,t:t+2} = \beta_0 + \beta_1 \text{GREENRATIO}_{f,t-3:t-1} + \Omega \textit{Controls}_{f,t-3:t-1} + \Gamma_f + \Gamma_{j \times t} + \varepsilon_{f,t}$ 

	$\stackrel{(1)}{_{S1INT_{t:t+2}}}$	(2) S2INT $_{t:t+2}$	$(3) \\ S3UPINT_{t:t+2}$	(4) S3DOWNINT <sub>t:t+2</sub>	(5) $LOGSALES_{t:t+2}$	(6) $LOGCAPEX_{t:t+2}$
$GREENRATIO_{f,t-3:t-1}$	0.210	0.017	0.001	0.324	0.002	-0.016
	(0.144)	(0.018)	(0.037)	(0.532)	(0.015)	(0.029)
Observations	39159	39159	39159	21521	39159	39068
R2	0.940	0.865	0.938	0.903	0.984	0.954
Controls	yes	yes	yes	yes	yes	yes
Industry-Year F.E.	yes	yes	yes	yes	yes	yes
Firm F.E.	yes	yes	yes	yes	yes	yes

 $Controls \ include: \ LOGSIZE, \ LOGPPE, \ LEVERAGE, \ ROE, \ M/B, \ INVEST/A, \ LOGASSETS, \ LOGAGE, \ BETA, \ VOLAT, \ RET, \ and \ MSCI. \ Standard errors are double clustered at firm and year dimension.$ 

 $\Rightarrow$  Possibly due to low ex-ante emissions?



## [2] Path dependency in the production of innovation Consistent with the Arrow replacement effect (Arrow 1962) & learning-by-doing (Arrow 1971)

 $\mathsf{PATENTRATIO}_{f,t} = \beta_0 + \beta_1 \mathsf{EMISSION}_{f,t-1} + \beta_2 \mathsf{AGE}_{f,t-1} + \beta_3 STOCK_{f,t-1} + \Omega Controls_{f,t-1} + \Gamma_c + \Gamma_{i*t} + \varepsilon_{f,t}$ 

	(1)	(2) GREENRATIO <sub>t</sub>	(3)	(4)	(5) BROWNRATIO <sub>t</sub>	(6)
$LOGS123UPTOT_{f,t-1}$	0.055**	-0.054***	-0.003			
,	(0.025)	(0.018)	(0.024)			
$LOGAGE_{f,t-1}$	-0.186***	-0.150***	-0.078			
	(0.036)	(0.031)	(0.118)			
$PATSTOCKGREEN(/100)_{f,t-1}$	0.053***	0.058***	-0.001			
	(0.011)	(0.011)	(0.005)			
$PATSTOCKBROWN(/100)_{f,t-1}$	-0.034***	-0.056***	0.009			
	(0.013)	(0.013)	(0.011)			
Country F.E.	yes	yes	yes			
Year F.E.	yes	no	no			
Industry X Year F.E.	no	yes	yes			
Firm F.E.	no	no	yes			
Observations	32366	31750	23643			
Pseudo R2	0.0364	0.109	0.221			

Estimated with Poisson pseudo-maximum likelihood. Other controls include: LOGSIZE, LOGPPE, LEVERAGE, ROE, M/B, INVEST/A, BETA, VOLAT, RET, and MSCI. Standard errors are double clustered at firm and year dimension.

## [2] Path dependency in the production of innovation Consistent with the Arrow replacement effect (Arrow 1962) & learning-by-doing (Arrow 1971)

 $\mathsf{PATENTRATIO}_{f,t} = \beta_0 + \beta_1 \mathsf{EMISSION}_{f,t-1} + \beta_2 \mathsf{AGE}_{f,t-1} + \beta_3 STOCK_{f,t-1} + \Omega Controls_{f,t-1} + \Gamma_c + \Gamma_{i*t} + \varepsilon_{f,t}$ 

	(1)	(2) GREENRATIO <sub>t</sub>	(3)	(4) B	(5) ROWNRATIO <sub>t</sub>	(6)
$LOGS123UPTOT_{f,t-1}$	0.055**	-0.054***	-0.003	0.277***	0.003	-0.007
	(0.025)	(0.018)	(0.024)	(0.044)	(0.043)	(0.087)
$LOGAGE_{f,t-1}$	-0.186***	-0.150***	-0.078	0.122*	0.083	-0.040
	(0.036)	(0.031)	(0.118)	(0.066)	(0.061)	(0.218)
$PATSTOCKGREEN(/100)_{f,t-1}$	0.053***	0.058***	-0.001	-0.114***	-0.104***	-0.018
	(0.011)	(0.011)	(0.005)	(0.027)	(0.034)	(0.011)
$PATSTOCKBROWN(/100)_{f,t-1}$	-0.034***	-0.056***	0.009	0.147***	0.123***	0.003
0 7.7-	(0.013)	(0.013)	(0.011)	(0.026)	(0.032)	(0.011)
Country F.E.	yes	yes	yes	yes	yes	yes
Year F.E.	yes	no	no	yes	no	no
Industry X Year F.E.	no	yes	yes	no	yes	yes
Firm F.E.	no	no	yes	no	no	yes
Observations	32366	31750	23643	32255	27933	13723
Pseudo R2	0.0364	0.109	0.221	0.0711	0.168	0.273

Estimated with Poisson pseudo-maximum likelihood. Other controls include: LOGSIZE, LOGPPE, LEVERAGE, ROE, M/B, INVEST/A, BETA, VOLAT, RET, and MSCI. Standard errors are double clustered at firm and year dimension.

# [3] Firms with higher green patent ratios tend to lose market share A form of emission displacement

 $MARKETSHARE_{f,t:t+2} = \beta_0 + \beta_1 Patent Ratio_{f,t-3:t-1} + \Omega Controls_{f,t-3:t-1} + \Gamma_f + \Gamma_{j \times t} + \varepsilon_{f,t}$ 

$\begin{array}{c} (0.008) \\ BROWNRATIO_{f,t-3:t-1} & 0.003 \\ (0.008) \\ 0.008) \\ 0.008 \\ 0$		(1)	(2)
$\begin{array}{c} (0.008) \\ BROWNRATIO_{f,t-3:t-1} \\ 0.003 \\ (0.008) \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ $	_	( )	• • •
(0.008)           Observations         115895           22         0.965           0.965         0.965           controls         yes           yes         yes           yes         yes	$GREENRATIO_{f,t-3:t-1}$		
0.965         0.965           Controls         yes         yes           Firm F.E.         yes         yes	$BROWNRATIO_{f,t-3:t-1}$		
Controls yes yes Firm F.E. yes yes	Observations	115895	115895
irm F.E. yes yes	R2	0.965	0.965
,	Controls	yes	yes
ndustry × Year F.E. ves ves	Firm F.E.	yes	yes
	Industry $ imes$ Year F.E.	yes	yes

Other controls include: LOGASSETS, LOGPPE, LEVERAGE, ROE, INVEST/A, LOGAGE, and PUBLIC. Standard errors are double clustered at firm and year dimension.



More green innovation does not translate into reductions in emissions

- $\Rightarrow$  Consistent with Jevons paradox
- $\Rightarrow$  Consistent with displacement effect
- Companies do not switch their innovation profile
  - $\Rightarrow$  Path-dependency consistent with Arrow replacement effect and learning-by doing
  - $\Rightarrow$  Path dependency extends beyond firm operations to the production network
- Policy implications:
  - $\Rightarrow$  Decarbonization may require coordination of efforts across companies and sectors
  - $\Rightarrow$  Public sector green industrial policy can help overcome ecosystem replacement effects

