

Transition to Green Technology along the Supply Chain

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Motivation

- Green transition requires switching from fossil fuels to cleaner energy sources **along the production chain**:
 - e.g., gasoline cars → electric vehicles: require batteries, which are also emissions intensive
- Broad consensus worldwide on need to speed up transition; but countries diverge on how to achieve the goal
 - Europe: Carbon tax, cap-and-trade; US: industrial policy (e.g., Inflation Reduction Act)
- This paper: a dynamic model of technological transition along the supply chain

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Strategic complementarity, reminiscent of Big-Push, but *cross-sector along the supply chain* ⇒ new insights

1. Multiple steady-states but a unique equilibrium
2. The social optimum requires both a carbon tax and targeted subsidies
3. Small and temporary sectoral subsidies (“small nudges”) to key sectors can have large long-run effects
4. If subsidies are limited, there is a network argument to start downstream
5. With suboptimal carbon prices, excess electrification can be a second best policy.
6. Misdirected industrial policy can permanently derail the green transition

- Macroeconomics of climate change:
 - IAMs: Nordhaus (1994), Golosov, Hassler, Krusell, and Tsyvinski (2014), ...
 - DTC literature: Acemoglu, Aghion, Bursztyn, and Hémous (2012), Acemoglu, Akcigit, Hanley, Kerr (2016), ...
 - Static production networks: King, Tarbush and Teytelboym (2019), Devulder and Lisack (2020), ...
- Strategic complementarities in technology adoption:
 - Murphy, Shleifer, and Vishny, (1989), Sturm (2023), ...
 - In an environmental context: Greaker and Midttømme (2016), Dugoua and Dumas (2021).
 - Novelty here: dynamic model with a unique equilibrium but multiple steady states (see also Crouzet, Gupta, and Mezzanotti, 2023).
- Industrial policy:
 - Big push (Murphy, Shleifer, and Vishny, 1989), Infant industry (Greenwald and Stiglitz, 2006),
 - Knowledge externalities: Liu (2019), Liu and Ma (2023), Donald (2023), Buera and Trachter (2024)

Baseline model: economic environment

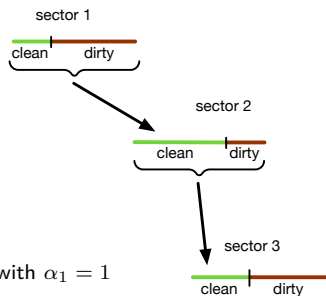
- Discrete time; representative households with preferences

$$U = \sum_{t=0}^{\infty} \beta^t \left(\ln c_t - \ell_t - \underbrace{a_t}_{\text{disutil. from emissions}} \right)$$

- Clean production is a vertical supply chain with N layers

$$\ln y_{it} = \int_0^1 \ln y_{it}(\nu) d\nu,$$

$$y_{it}(\nu) = \underbrace{\ell_{dit}(\nu)}_{\text{dirty process}} + \mathbf{1}_{\text{greenified}}(\nu) \underbrace{\left(\frac{e^z \ell_{cit}(\nu)}{\alpha_i} \right)^{\alpha_i} \left(\frac{m_{it}(\nu)}{1 - \alpha_i} \right)^{1 - \alpha_i}}_{\text{clean process}}, \text{ with } \alpha_1 = 1$$



- Adopting the clean technology ("greenify") requires a one-time cost $\phi_i(\nu)$, with CDF $F_i(\cdot)$
- Disutility from emissions is proportional to $(\xi \times)$ the use of labor in dirty production process
- Key assumption: clean supply chain does not benefit dirty production (i.e., gas engines do not use batteries)
 - (But there could be a complex fully dirty chain).

Market structure and markups

- Dirty production is competitive
 - government may impose a carbon tax τ ; Pigouvian tax sets $\tau = \xi$, disutility of emissions
- If a producer pays the cost to transition: one-period monopoly, Bertrand-competes with dirty producers
 - after one period, clean production is also competitive
 - assume that given carbon tax, clean production is cheaper; let $Z \equiv z + \ln(1 + \tau)$ be its tax-inclusive cost advantage
- Key state variables are the shares of varieties that have been greenified in each sector: $\{\chi_{it}\}_{i=1}^N$

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- Key state variables are the shares of varieties that have been greenified in each sector: $\{\chi_{it}\}_{i=1}^N$
- Producer of a newly transitioned variety charges a mark-up:

$$\theta_{i,t} = e^{Z\mu_{it-1}},$$

- μ_{it} is the network-adjusted share of clean content when producing a clean variety in sector i :

$$\mu_{1t} = 1 \quad \text{and} \quad \mu_{it} = \alpha_i + (1 - \alpha_i) \chi_{i-1,t} \mu_{i-1,t}.$$

- more greenification upstream ($\mu_{i,t-1} \nearrow$) \implies higher mark-up for newly transitioned varieties

Revenues, profits, and incentives to adopt the clean technology

- Revenue of a variety in the most downstream sector is $r_{Nt} = 1$ (given normalization). For all $i < N$,

$$r_{it} = \underbrace{(1 - \alpha_{i+1})}_{\text{input cost share in } i+1} \tilde{\chi}_{i+1,t} r_{i+1,t}, \quad \tilde{\chi}_{i+1,t} \equiv \underbrace{\chi_{i+1,t-1}}_{\text{already elec.}} + \underbrace{(\chi_{i+1,t} - \chi_{i+1,t-1})}_{\text{newly elec.}} e^{-Z\mu_{i+1,t-1}}$$

- By induction, revenues increase with the cost share of clean varieties downstream ($j > i$)

$$r_{it} = \prod_{j=i+1}^N [\tilde{\chi}_{jt}(1 - \alpha_j)]$$

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- Profits for a newly transitioned variety in sector i are given by:

$$\pi_{it} = (1 - e^{-Z\mu_{i,t-1}}) \prod_{j=i+1}^N \tilde{\chi}_{jt} (1 - \alpha_j)$$

- producers greenify additional varieties if and only if $\pi_{it} > \phi_i(\nu) \implies \chi_{it} = F_i(\pi_{it})$
- Upstream greenification affects sector i with a delay through an input cost effect (in $\mu_{i,t-1}$)
- Downstream greenification affects sector i contemporaneously through a market size effect (in $\tilde{\chi}_{jt}$)

Equilibrium dynamics and steady-state

- The law of motion for $\{\chi_{it}\}$ is then given by: $\chi_{it} = \max\{\chi_{i,t-1}, F_i(\pi_{it})\}$
- In a steady-state, $\{\chi_i\}$ is time-invariant

Proposition 1. For given carbon tax τ , generically there may exist multiple steady-states whenever $N \geq 2$.

- Low $\{\chi_i\}$ in downstream \implies low demand for upstream inputs \implies low $\{\chi_i\}$ in upstream
- Low $\{\chi_i\}$ in upstream \implies low cost advantage for downstream production \implies low $\{\chi_i\}$ in downstream

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Proposition 2. Given initial condition $\{\chi_{i0}\}_{i=1}^N$, the economy features a unique equilibrium path $\{\chi_{it}\}_{t>0}$.

- Intuition: greenification creates additional demand contemporaneously but reduces input costs with a delay

Social planner (1)

- Social planner solves

$$\max_{c_t, \ell_{dit}, \ell_{cit}, \chi_{i,t}} \sum_{t=0}^{\infty} \beta^t \left(\ln y_{Nt} - (1 + \xi) \sum_i \ell_{dit} - \sum_i \ell_{cit} - \sum_i \int_{\chi_{i,t-1}}^{\chi_{i,t}} \phi_i(s) ds \right).$$

- All electrification happens immediately in the optimum \Rightarrow immediate steady-state.
- With a Pigouvian tax $\tau = \xi$, labor allocation for given χ_i is optimal in steady-state,
- and problem amounts to choosing the correct technology levels $\{\chi_i\}$.

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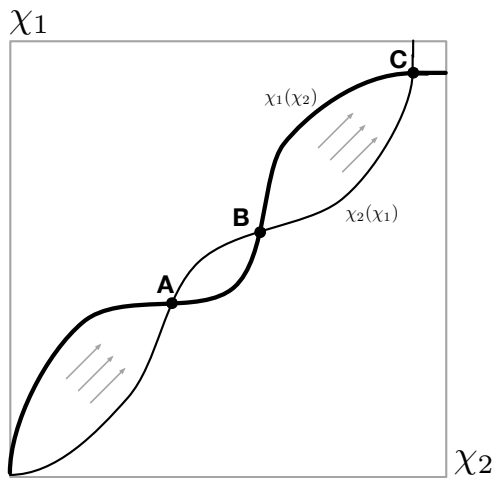
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- Given Pigouvian tax, decentralized incentives in steady-state still differ from the planner's in 3 ways:

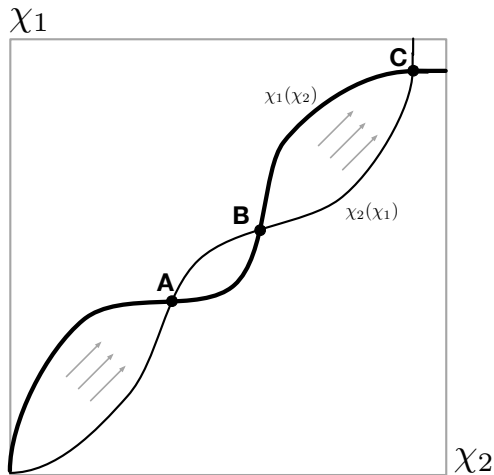
$$\underbrace{\chi_i = F_i \left((1 - e^{-\mu_i Z}) \prod_{j=i+1}^N \chi_j (1 - \alpha_j) \right)}_{\text{decentralized correspondence}}, \quad \underbrace{\chi_i = F_i \left(\frac{\mu_i Z}{1 - \beta} \prod_{j=i+1}^N \chi_j (1 - \alpha_j) \right)}_{\text{planner's FOC with respect to } \chi}$$

- 1) time horizon difference (call for a uniform subsidy)
- 2) profit vs. consumer surplus from electrification (but if Z is small, $1 - e^{-\mu_i Z} \approx \mu_i Z$)
- 3) there exist multiple steady-states due to strategic complementarity.

Social planner (2)

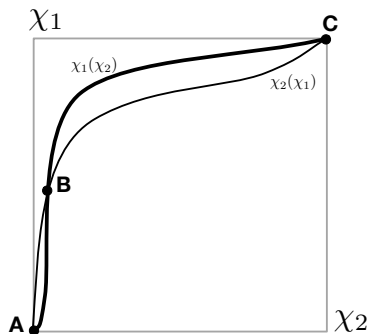


Social planner (2)



Proposition 3. (1) The optimal *steady-state* can be uniquely implemented through a carbon price together with a whole set of time-varying sector specific subsidies for adopting the clean technology.
(2) Generically, carbon tax + uniform (i.e. untargeted) clean subsidy cannot implement the optimal SS.

Limited subsidies can make a big difference



- Example with two layers and three SS: no greenification (**A**), full greenification (**C**), and in-between (**B**)
 - a small and temporary subsidy, to the “key” sector ($\chi_2 > \chi_2^B$), can kick-start the economy from the no-greenification SS (**A**) to a little beyond the unstable “in-between” greenification steady-state (**B**)
 - thereafter, on its own the economy will move towards the full-greenification steady-state
- **Implication:** a small, targeted nudge may be sufficiently effective; “big push” is not needed

Which sector to target? Propagation of adoption incentives in steady-state

- Imagine that the government is constrained to conduct local intervention ($d \ln \chi$) in at most one sector. Should it target a downstream or an upstream sector?

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Proposition 4. (a) An increase in greenification downstream raises incentive one-for-one:

$$\frac{\partial \ln \pi_i}{\partial \ln \chi_k} = 1 \text{ if } k > i.$$

(b) An increase in greenification upstream raises incentive less-than-one-for-one:

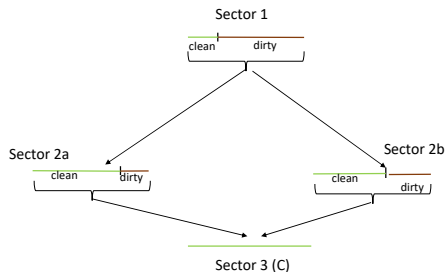
$$\frac{\partial \ln \pi_i}{\partial \ln \chi_k} = \frac{\mu_i Z e^{-\mu_i Z}}{1 - e^{-\mu_i Z}} \frac{\left(\prod_{j=0}^{i-k-1} (1 - \alpha_{i-j}) \chi_{i-j-1} \right) \mu_k}{\mu_i} < 1 \text{ if } k < i.$$

(c) Incentives propagated from upstream relies on greenification along the chain:

$$\partial \ln \pi_i / \partial \ln \chi_k \rightarrow 0 \text{ if } \chi_j \rightarrow 0 \text{ for any } j \text{ such that } k \leq j < i.$$

- Intuition: the upstream good is not the only input for a greenified variety; labor is the other input
 - hence only partial pass-through of upstream costs to downstream profit share ($\frac{d \ln(\alpha_i + (1 - \alpha_i) \chi_{i-1})}{d \ln \chi_{i-1}} < 1$)
- Implication:** when initial $\{\chi_i\}$ is low, the planner should always target downstream (provided that the relative marginal cost of greenification is bounded across sectors)
- Also, downstream intervention immediately propagates; upstream intervention propagates with a delay

Generalization: 2 downstream sectors

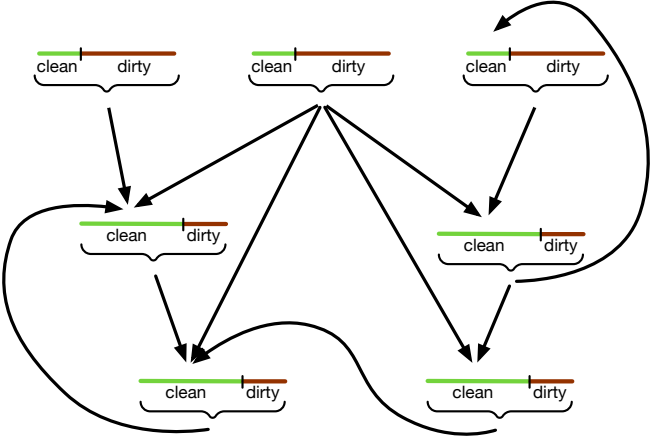


- Sectors 2a and 2b have the same labor share α and β_a, β_b denote their final consumption shares.
- Cross-sectoral effects of electrification on electrification incentives:

$$\frac{\partial \ln \pi_1}{\partial \ln \chi_{2k}} = \frac{\chi_{2k} \beta_k}{\chi_{2a} \beta_a + \chi_{2b} \beta_b} \quad \text{and} \quad \frac{\partial \ln \pi_{2k}}{\partial \ln \chi_1} = \frac{\mu_2 Z e^{-\mu_2 Z}}{1 - e^{-\mu_2 Z}} \frac{\chi_1 (1 - \alpha)}{\alpha + \chi_1 (1 - \alpha)}.$$

- For low χ , targeting downstream sectors has a bigger effect on electrification incentives than targeting the upstream sector.
 - This need not be true when χ_1 is far from 0 (think for example of electricity as sector 1).

Generalization beyond a vertical chain: clean production may use any inputs



- Next: generalize the steady-state formula for how greenification incentives propagate in the network
 - if the network is acyclic, then equilibrium is unique (SS characterization does not rely on unique eqm.)

Generalization beyond a vertical chain: clean production may use any inputs

- In steady-state, profit rent from greenification of a new variety in sector i :

$$\pi_i(\nu) = \underbrace{(1 - e^{-Z\mu_i})}_{\text{profit margin}} \underbrace{r_i}_{\text{revenue}} \Rightarrow \left[\frac{d \ln \pi_{ii}}{d \ln \chi_k} \right] = \text{Diag} \left(\frac{Ze^{-\mu_i Z}}{1 - e^{-\mu_i Z}} \right) \left[\frac{d \mu_i}{d \ln \chi_k} \right] + \left[\frac{d \ln r_i}{d \ln \chi_k} \right]$$

- Profit margin depends on the greenification of one's supplier, supplier's supplier, and so on

$$\left[\frac{d \mu_i}{d \ln \chi_k} \right] = \left(\hat{\Sigma}^X + (\hat{\Sigma}^X)^2 + \dots \right) \text{Diag}(\mu)$$

- $\hat{\Sigma}_{ik}^X$ is sector i 's cost share on green inputs from sector k

- Revenue depends on the greenification of one's customer, customer's customer, and so on

$$\left[\frac{d \ln r_i}{d \ln \chi_k} \right] = (\Omega + \Omega^2 + \dots)$$

- Ω_{ik} is the fraction of sector i 's revenue earned by selling to k

- In steady-state, incentives from downstream propagate one-for-one (each row of Ω sums to one)

- from upstream: propagate less than one-for-one; moreover, limited by the “weakest link” (row-sum of $\hat{\Sigma}^X < 1$, goes to zero as $\chi_k \rightarrow 0 \forall k$)

Underpriced emissions: industrial policy as a second best

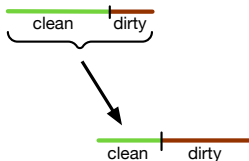
- So far, industrial policy is a complement to carbon pricing. But often, carbon is underpriced: $\tau < \xi$.
- How would a social planner use industrial policy as a second best solution?
 - We consider a steady-state (social planner can remove the monopoly distortion)

Proposition 5. In the absence of a Pigouvian carbon price, optimal greenification satisfies

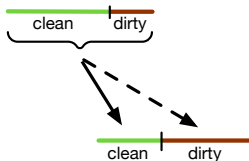
$$\chi_i = F_i \left(\frac{\ln((1 + \tau) e^z)}{1 - \beta} \mu_i \prod_{j>i} [\chi_j (1 - \alpha_j)] + \frac{\xi - \tau}{1 - \beta} \left(- \frac{\partial \ell_d}{\partial \chi_i} \right) \right).$$

- Greenification is distorted so as to greenify more sectors whose emissions depend more on greenification.
- Interestingly, in a vertical supply chain $\frac{\partial \ell_d}{\partial \chi_i}$ tends to be larger for downstream sectors, particularly when electrification is low.
 - Complementarity in emission reductions: greenification in each sector is more effective when the others are more electrified...
 - ... but this complementarity is asymmetric as the effect of upstream greenification on emissions vanishes if greenification downstream is low.

Generalization: use of clean vertical chain by the dirty sector

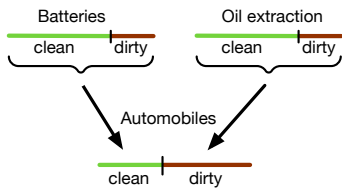


- So far, we have assumed only inputs to clean production can be greenified



- Qualitative insights go through if dirty technology uses the same inputs but less intensively
 - so that greenification remains strategically complementary across sectors

Strategic substitutability: misguided policy can permanently derail the green transition



- Suppose there are two upstream sectors: oil extraction (for gasoline cars) and batteries (for electric cars)
 - strategic complementarity between batteries and electric cars
 - strategic substitutability between oil extraction and {batteries, electric cars}
- Two implications
 1. Industrial policy that favors oil extraction can backfire and halt the transition that would have otherwise occurred in electric cars without government intervention, thereby reducing long-term welfare
 - an additional rationale to target downstream sectors (electric cars)
 2. Laissez-faire may feature excess greenification in oil extraction compared to the ex ante social optimum

Conclusion

- A parsimonious model of dynamic green transition along the supply chain
 - features strategic complementarity, reminiscent of Big-Push, but *cross-sector along the supply chain*
 - a minimal model: no production distortion in steady-state
 - isolate the inefficiency and coordination in the adoption of green technology
- New insights:
 1. Multiple steady-states but a unique equilibrium
 2. The social optimum requires both a carbon tax and targeted subsidies
 3. Small and temporary sectoral subsidies (“small nudges”) to key sectors can have large long-run effects
 4. If subsidies are limited, there is a network argument to start downstream
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In progress: a simple calibration based on hydrogen in heavy-duty transport.

Appendix: Iron and steel (1)

- Focus on global iron and steel production (7-9% of total CO2 emissions).
 - To achieve high-quality zero-emission steel, need to switch from fossil-fuels to hydrogen.
 - But hydrogen itself can be produced in a dirty way (using methane) or a clean way (using water).
- Consider $N = 2$, sector 2 is steel and sector 1 is hydrogen:
 - Map the innovation costs with the excess initial vs n-th of a kind clean levelized costs.
 - Map n-th of a kind cost to the productivity shifter z .
 - Map the distribution of innovation costs $\phi_1(\chi_1)$ to the distribution of excess initial vs. n-th of a kind clean hydrogen across countries.
 - Allow for heterogeneity in the relative input efficiency parameter z_i , the emission rate ξ_i , and a TFP parameters A_i .
 - Consider an uniform carbon tax in USD.

Appendix: Iron and steel (2)

- At \$25/tCO₂: 3 stable steady-states, (0%, 0%), (59%, 54%), and (82%, 84%).
 - Diff. in emissions between (0%, 0%) and (82%, 84%) s.s. = 2.4 billion tons of CO₂ per year (close to total EU emissions).
 - At \$12.5/tCO₂: 1 stable s.s. (0%, 0%). At \$100/tCO₂, 1 stable s.s. (100%, 100%).

