

Global Production Networks and Water Depletion

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Motivation

Globalization: local consumption → global environmental consequences

- Why? Complex input-output (IO) linkages across the globe

High attention on CO2 emissions (Copeland and Taylor, 2004, ...)

- Main target of (and issues with) international policy (Nordhaus, 2015)
- Sizeable CO2 footprint of globalization (Shapiro, 2016, 2021)

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This project: focus on **global water** resources.

Motivation – Why Water?

Crucial for domestic consumption and as an input of production

- Agriculture, livestock, textile, steel, brewery, ...

Globalization → **virtual water trade** (Hoekstra and Chapagain, 2011)

- Factor trade → spatial patterns of economic activity (Davis and Weinstein, 2001; Debaere, 2014)

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Policy concern: upcoming **global water crisis** (OECD's Mazzucato et al., 2023)

- Many (highly populated) water-stressed countries (Carleton et al., 2024)
- Importance of (trade in) agriculture (Carleton et al., 2023)

Research Questions and Outline

1. Does (direct+indirect) water trade → pressure on water stressed countries?
2. What is the role of trade policies (e.g., tariffs) vs. domestic distortions?

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This project: **theory + data** = economy's burden in terms of global water stress

1. Theory: network representation of the global economy
2. Data: novel country-sector IO data (1995-2020) + others

Current results: central role of agriculture, non-agric. **indirectly important!**

- Why? Indirect demand (i.e., inputs) of non-agricultural industries
- ↑ intermediate demand from water-stress countries

Theory

Theory – The World Economy as a Production Network

$n \in N$ countries, $s \in S$ sectors $\rightarrow i, j \in \Omega = N \times S$ sector-regions. i 's output (\$):

$$\begin{aligned}x_i &= \overbrace{\sum_n c_{in}}^{\text{final goods}} + \overbrace{\sum_{j \in \Omega} z_{ij}}^{\text{interm. goods}} \\&= c_i + \sum_{j \in \Omega} a_{ij} x_j, \quad \text{where}\end{aligned}\tag{1}$$

$$a_{ij} = z_{ij} / x_j\tag{2}$$

is j 's expenditure share in i goods (as intermediate input)

Theory – The World Economy as a Production Network

Equation (1) is a system of $|\Omega|$ equations; solving for \mathbf{x}

$$\begin{aligned}\mathbf{x} &= \mathbf{c} + \mathbf{A}\mathbf{x} \rightarrow \mathbf{x} = \mathbf{L}\mathbf{c}, \quad \text{where} \\ \mathbf{L} &= (\mathbf{I} - \mathbf{A})^{-1}\end{aligned}\tag{3}$$

is the Leontiev inverse that reflects i 's importance within supply chains; i.e.

$$\ell_{ij} \in \mathbf{L} \quad \leftrightarrow \quad \ell_{ij} = a_{ij} + \sum_{r=1}^n a_{ir}a_{rj} + \dots \quad (+1 \text{ if } i = j)\tag{4}$$

captures all possible (and infinite) paths linking i and j .

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IO data on $\{\mathbf{x}, \mathbf{A}, \mathbf{c}, \mathbf{L}\} \rightarrow$ direct+indirect factor usage in global supply chains

Data

Data: IO + Water Extraction + Water Endowments

GLORIA: MRIO data on $n = 164$ countries $\times 46$ sectors $\rightarrow |\Omega| \sim 6K$

- **Time-varying data** from 1995 to 2020 (raw data >200TB!)

Retrieve/construct (as in Campiglio et al., 2022)

- IO structure of the World economy $\{\mathbf{Z}_t, \mathbf{c}_t\} \rightarrow \{\mathbf{A}_t, \mathbf{L}_t\}$
- $\mathbf{W} = \{W_{it}\} \equiv i\text{-year-level } \underline{\text{water extraction}}$

FAO-AQUASTAT: n -level renewable water resources (Kohli and Frenken, 2015)

- Inland waters renewed by water cycle \rightarrow flows, not stocks
- Long-term average (late 20th century) $\equiv \mathcal{W}_n$ (in $10^6 m^3/y$)

Theory + Data: Production Networks and Water Depletion

Production Networks and Water Depletion

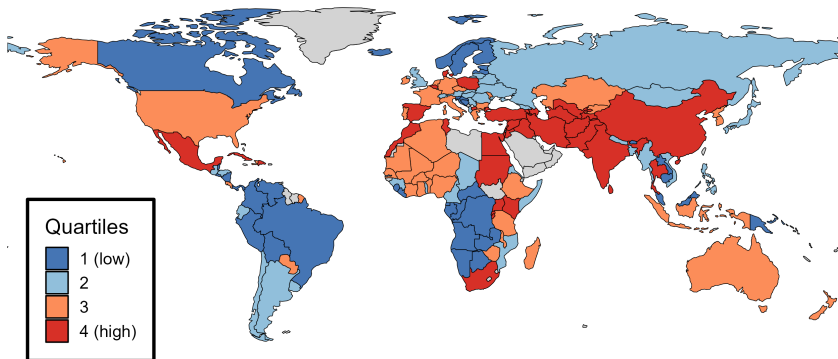
1. Does (direct+indirect) water trade → pressure on water stressed countries?
 - a. Which are the most water stressed countries nowadays?
 - b. What is the role of agriculture in the global usage of productive water?
 - c. How much (agric.) indirect water use → water stressed countries?
 - d. How water-intense are other sectors (directly+indirectly)?
2. What is the role of trade policies (e.g., tariffs) vs. domestic distortions?
 - 1.a.-1.d. → dimensions to investigate!

Which are the most water stressed countries nowadays?

For 1.a., define water stress $W_n^S = \sum_{i \in \Omega_n} W_{it} / \mathcal{W}_n$, $t \equiv$ average 2016–2020

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What is the role of agriculture?

For 1.b., agric. productive water use (%)

$$W_t^A = \sum_{i \in \Omega_A} W_{it} / W_t,$$

where $W_t \equiv \sum_i W_{it}$.

What is the role of agriculture?

For 1.b., agric. productive water use (%)

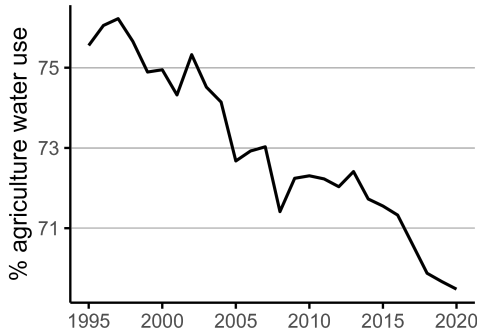
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- Agric.: ~ **70% global water use**
- Similar to ~Dubois (2011)

Other i sectors' importance (~ 30%):

- Geogr. distr. + up/downstreamness



Indirect water use → water stressed countries?

For 1.c., direct water intensity: $w_{it} = W_{it}/x_{it}$

Then, i 's intermediate water use (%)

$$W_{it}^Z = w_{it} \sum_{j \in \Omega} a_{ijt} x_{jt} \quad / \quad \sum_{i \in \Omega} W_{it}$$

Indirect water use → water stressed countries?

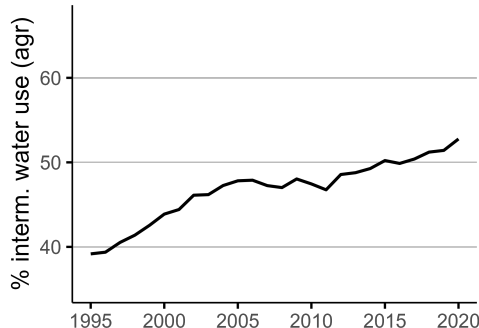
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For agric. (Ω_A) ~ **50% as intermediates**

- Downstream distortions matter!



Indirect water use → water stressed countries?

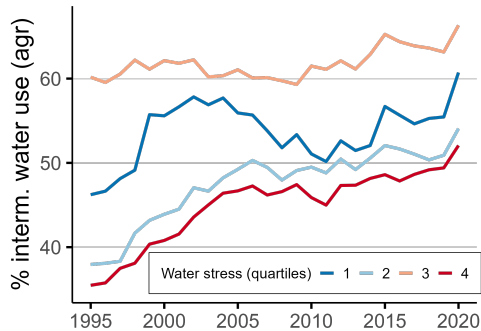
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- Downstream distortions matter!
- Water-stressed countries ↑ interm.



How water-intense (directly+indirectly) are other sectors?

For 1.d., ℓ_{ij} in (4) $\rightarrow i$'s total water intensity

$$\begin{aligned}\omega_i &= \sum_{j \in \Omega} \ell_{ji} w_j = \ell_{ii} w_i + \sum_{j \neq i} \ell_{ji} w_j = \dots \\ &= w_i + \underbrace{\sum_{j \neq i} \left(a_{ji} + \sum_{r=1}^n a_{jr} a_{ri} + \dots \right) w_j}_{\text{indirect water intensity}}\end{aligned}$$

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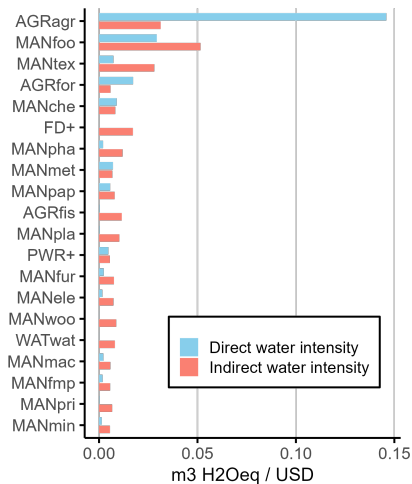
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Many indirectly water-intensive industries

- Food processing, textile, chemicals, ...

Related **distortions propagate upstream!**



Takeaways

Productive **water usage**: central role of agriculture and **other industries**

- IO supply chains → global network of water demand (Adao et al., 2017)

Next steps on the role of trade (in intermediates):

- Relationship with trade policy (across all sectors, see Shapiro, 2021)
- Propagation of other distortions (e.g., NTB, subsidies, **market failures**, ...)
- GE experiments with alternative (against optimal) policies

Thank you

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