

# Empowering Carbon Accounting: From Data to Action

People and perspectives meet: an international workshop on carbon content measurement

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# Why are central banks interested?

Climate change is a **risk** – for everybody, but also for financial stability.

- **Physical risk** – from the physical aspects of climate change: heat stress, wildfires, thunderstorms, water stress, sea level rise
- **Transition risk** – the transition to a low carbon economy will put an end to the business model of firms that cannot adapt.

For capital market participants, the systemic components of these risks are **external effects**. They should enter into the pricing of finance and regulatory standards. With other types of risks this is being carried out through capital requirements (eg Basel accord).

# Why are central banks interested?

- [Network of Greening the Financial System](#): an association of most central banks world-wide, co-ordinating and exchanging work on sustainability issues
- **Very active research work** in most business areas of central banks: Financial Stability, Banking Supervision, Economics, Statistics
- The Bundesbank has set up a **new Directorate General on sustainability issues**
- The Statistics Departments in the Eurosystem are setting up a [new range of experimental statistics](#), monitoring the emissions financed by the banking system

Central banks as well as other policymakers are yet **missing reliable activity data** on which policy action could be based.



Irving Fisher Committee on  
Central Bank Statistics



# Carbon content measurement for products, organisations and aggregates: creating a sound basis for decision making

**International workshop** organised by the IMF, the BIS/IFC, Eurostat, the Deutsche Bundesbank, the Banco Central de Chile and the University of Oxford Blavatnik School of Government

**21-13 February 2024, Hamburg, Germany**

[Link to conference website, incl presentations](#)

## Workshop participants

- In Hamburg more than 60 live representatives from
  - international organizations, central banks, ministries, ESG reporting standard setters, statistical offices, corporate accountants, data platform providers, satellite data providers, EU Commission, enterprises, universities
  - six continents (the Americas counting as two)
- More than 200 registered virtual participants worldwide

**Consistent results and findings from all participants.**

# "Only what gets measured, gets managed" (Bo Li)

Reliable and readily available measures of **carbon content** enable

- **Companies** to align their production processes in a climate-friendly way,
- **Investors** to direct their capital towards climate-friendly investments if they wish,
- **Banks** to better assess the climate risks in their portfolios,
- **Governments and regulators** to intervene if necessary, and
- **Consumers** to better understand the consequences for the environment of their decision to purchase a particular product or service.

Carbon content information is a **necessary condition** for **rational**, environmentally-oriented **decision making**.

# "Only what gets measured, gets managed" (Bo Li)

Carbon content information is produced and needed on three levels:

- **Aggregate level -- country and sector** **statistics**
- **Company level** **non financial reporting**
- **Product level** **carbon accounting**

As yet, measurements and measurement concepts are unrelated. There is **no joint framework**, **no cross-validation**, no way to use data from one level to **fill data gaps** in the other.

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Carbon content information is produced and needed on three levels:

- **Aggregate level -- country and sector** **statistics**  
**G 20 Data Gaps Initiative (DGI), ECB ESG climate indicators**
- **Company level** **non financial reporting**  
**ISSB Standards, EU Legislation, specifically CSRD and ESRS**
- **Product level** **carbon accounting**  
**industry initiatives (chemical industry, automobiles), accounting research**

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# Direct and indirect emissions and total carbon content

Consider the *bill of material* (BoM) of product  $k$ , with  $a_{k,i}$  being the quantity of good  $i$  embodied in the production process:

$$\mathbf{a}_k = (a_{k1} \quad a_{k2} \quad \dots \quad a_{kK})'$$

Let  $d_k$  be the amount of GHG directly emitted and  $c_i$  be the carbon content of input  $i$

direct emissions

indirect emissions

valuation structure of inputs

Then the carbon content of  $k$  is given as the **sum of direct and indirect emissions**:

Carbon content vector

$$c_k = d_k + \mathbf{c}'\mathbf{a}_k = d_k + \sum_i c_i a_{ki} \quad (1)$$

quantity structure of inputs

If the  $c_i$  are known, we can calculate the carbon content of product  $k$  directly.

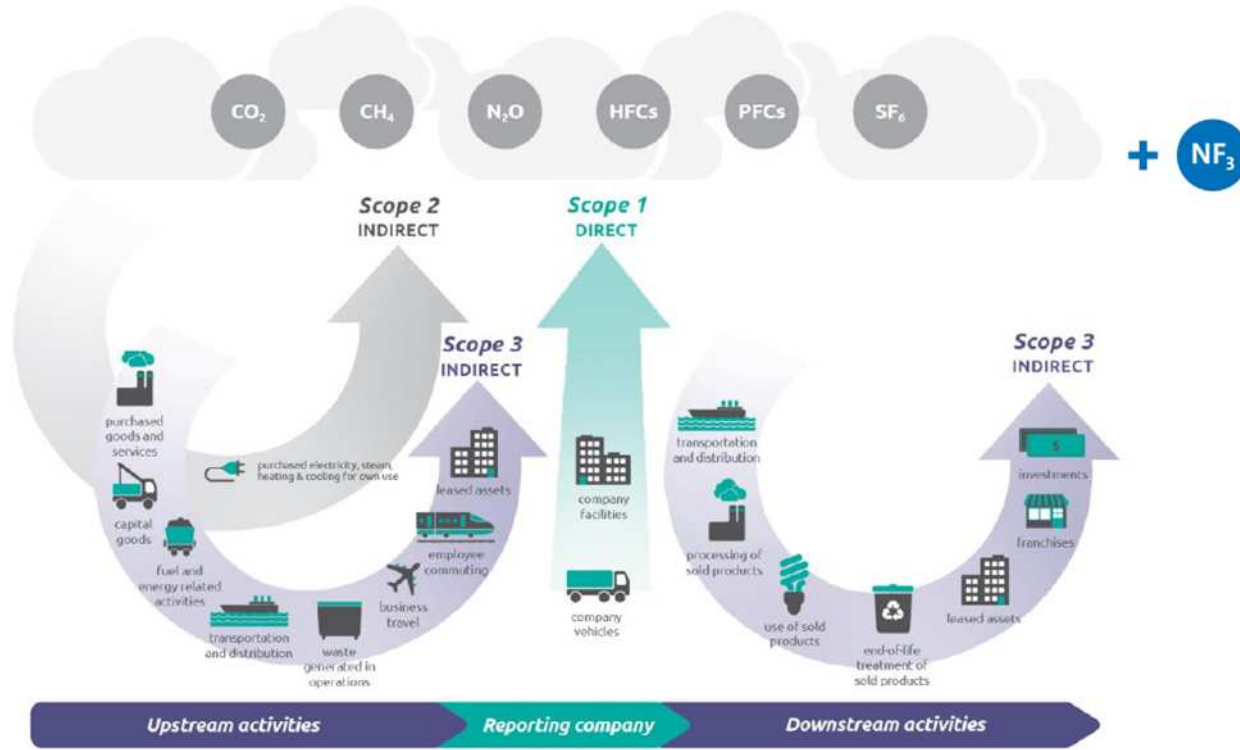
# The hen and the egg problem

**What if we do not know the carbon content of our inputs?**

**Three answers:**

- Try to understand your value chain and quantify direct emissions on each stage, then sum up  
**Drilling down the value chain: The tao of the GHG protocol**
- From knowledge of input requirements, solve for carbon content of all products in the system  
**Explicit knowledge: The tao of IO**
- Make your input provider give you the required information  
**Implicit knowledge: The tao of cumulative carbon accounting**

# The tao of GHG Protocol



Source: Greenhouse Gas Protocol (2011): *Corporate value chain (Scope 3) accounting and reporting standard*.



# The tao of IO

If the  $c_i$  are unknown, the equation is **recursive**. Equation (1) is an **IO model for production**. We can solve for the GHG value of all products simultaneously. Let

$$\mathbf{A} = (\mathbf{a}_1 \quad \mathbf{a}_2 \quad \dots \quad \mathbf{a}_K)$$

be the matrix of the BoMs for all produced goods. With  $\mathbf{d}$  the vector of direct emissions for products 1, ...,  $K$ , we may write:

$$\mathbf{c}' = \mathbf{d}' + \mathbf{c}'\mathbf{A}$$

*This is how actual IO works using industry level data from different countries.*

and solving for  $\mathbf{c}$  yields

$$\mathbf{c}' = \mathbf{d}'(\mathbf{I} - \mathbf{A})^{-1}$$

*It shows how the carbon content of products is derived from direct emissions and interlinkages* (2)

Carbon contents  
of all goods

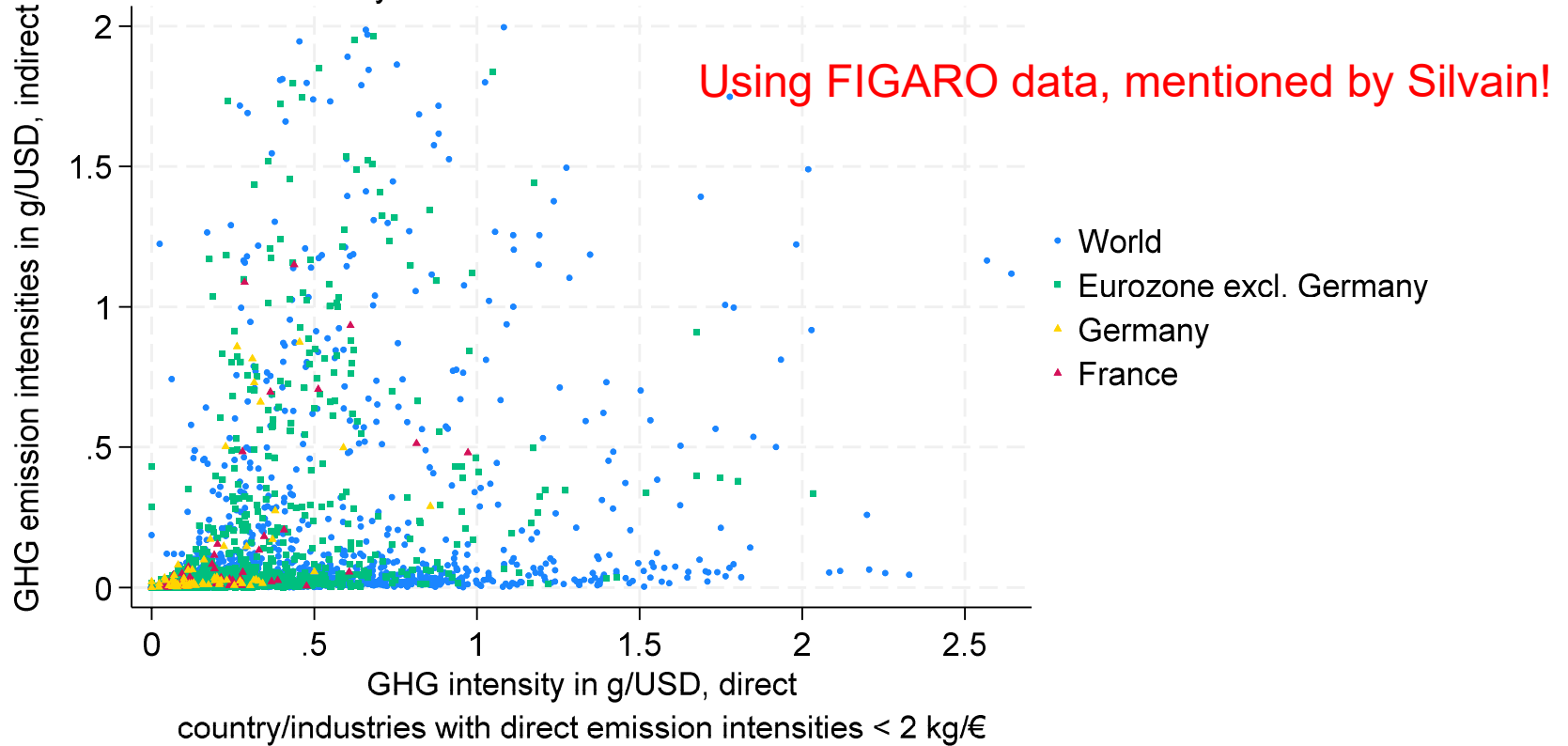
Direct emissions  
for all goods

Leontief inverse, reflecting  
production interlinkages

# The tao of IO

## Indirect and direct emission intensities

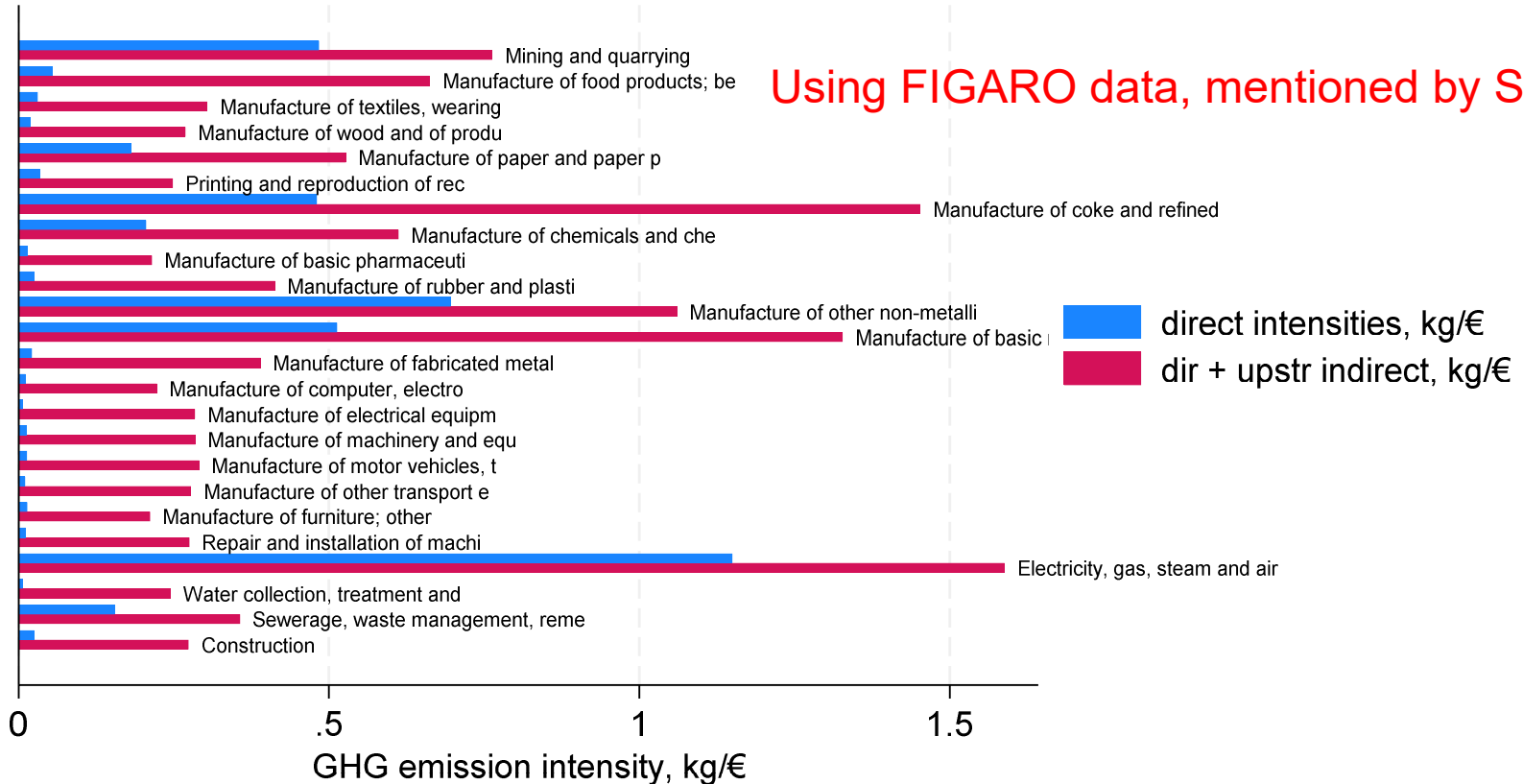
Industry level data derived from FIGARO



# The tao of IO

## Germany: GHG footprint manufacturing 2021

### Direct and indirect GHG emission intensities



# The tao of cumulative carbon accounting

**E-liability** is a prominent version of cumulative carbon accounting. Proposed and developed by **R. Kaplan (Harvard) and K. Ramanna (Oxford)** since 2021. In France, the same idea is propagated under the name of **3-D method** by '**carbones sur factures**', initiated by **Jérômes Cazes**.

Cumulative accounting works straight from the definition of carbon content:

$$c_k = d_k + \mathbf{c}'\mathbf{a}_k = d_k + \sum_i c_i a_{ki}$$

Like VAT, carbon content information is passed through the system, from input provider to producer and further down the supply chain, to the end-user. To allocate emissions to output, all standard methodology of cost accounting is used! Direct and indirect emissions are treated as **accounting liabilities**.

Direct information from providers or own measurement have highest priority. Data gaps are filled using estimates, eg from statistics.

# Top down and bottom up

Producers do not need to know the carbon contents of the entire economy, **only those of their own providers** (or estimates thereof), just as for **cost accounting** we do **not need to know the entire price system, just what our providers charge.**

If all producers give a fair estimate of eq (1) using the information they have, i.e.

- Direct emissions,
- Bill of Material (BoM),
- GHG values of input providers if available, estimates if not

and if this information is disclosed and used by all participants alike, in equilibrium the resulting system of GHG values **will correspond to the solution given by eq (2)**

On convergence see the presentation of François and von Kalckreuth, Ulf, Pulling ourselves up by our bootstraps: the greenhouse gas value of products, enterprises and industries, [Deutsche Bundesbank Discussion paper 23/2022](#).



# Calculating carbon content

- **We may approximate missing input carbon content** using
  - sectoral data from SEEA and EEIO models
  - granular data from company level data on provider firm
  - granular carbon content of reference products
- Disclosed carbon contents and data for proxy valuations can be **disseminated centrally!** It is important that producers use their proprietary information on inputs and direct emissions!
- Tomorrow in Session 3b: The use of statistics data in carbon accounting, simulation study based on US data

# The workshop: common points emerging (1)

The workshop was a testing ground for identifying joint views and shared issues to solve, among industry specialists, academics, standards-setters, central bankers, and statisticians.

**Key message:** carbon content information can be gathered and processed alongside financial information, using the same concepts and the same infrastructure:

- Balance sheets
- Financial and cost accounting

This is a **vision** and a **challenge**

Essential role of carbon content – direct plus upstream indirect emissions -- for cumulative carbon accounting

## The workshop: common points emerging (2)

The workshop was a testing ground for identifying joint views and shared issues to solve, among industry specialists, academics, standards-setters, central bankers, and statisticians.

- Crucial role of **reliable and relevant carbon content data** at both macro and micro levels
- We need to move fast, therefore the need to **leverage on what exists**
- Need for a global approach -- **compatible standards**
- The importance of **process efficiency**, minimising burdens on entities
- The application of latest **digital technologies** for compilation, reporting and data flow
- The role of **incentivisation** techniques
- The benefits of **inter-disciplinary cooperation** (industry specialists, academics, standards-setters, central bankers, statisticians...)

# Statistical data

- Macro statistics are the predominant form of public data available now
- But they are:
  - **Highly based on assumptions** >> can be improved with data from industry
  - **Not granular** >> need to work on more detailed industry/product breakdowns
  - **Patchy in coverage** across countries >> role of Data Gaps Initiative
  - Role of statistics to help filling gaps and support convergence in microdata
- Importance of efficient **statistical access to emerging microdata, sharing of classifications and definitions** where possible

# Direct measurement

- Situation is **unsatisfactory**. Estimates and rules of thumb predominate. No clear view of total emissions
- Workshop saw many innovative approaches...
- Increasing role of **satellite imagery** → in this conference an entire session
  - Certainly at macro level
  - Surprising advances at micro level
- Combining / contrasting direct measurement data – they can build on each other
- How can developing expertise at industry and scientific levels be pooled?

# Making information available

- Challenge to present carbon content data alongside financials
  - **At macro level** for policy purposes
  - **At entity level**, alongside financial statements
  - **On products** in an informative and standardised way
- How to bring data together?
  - **Commercial initiatives**
  - **The ECCBSO / CMFB** initiative: collecting CSRD company level data for statistics
  - Possible proliferation of data bases

# Conclusion

- For **direct emissions, direct measurement** should have priority (incl. satellite recognition and measurement based on chemical composition)
- For **upstream indirect** emissions, priority should be with **communication by input providers**
- **Official Statistics can help to estimate Scope 2 and upstream Scope 3** data where no direct information from the supply chain is available
  - Emission data and Input-Output data within multi-regional Input-Output tables
  - Disaggregated information for industries where emission intensities are heterogeneous will enhance the quality of firm level estimates
  - Distinction between various modes of energy production needed
- **Official Statistics can set a good example for data compilation:**  
Strict accounting approach in macro statistics