



Global Trade Analysis Project

# Global Greenhouse Gas Taxes on Food Products: Economy-wide, Environmental and Dietary Implications

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# Outline

1. Motivation
2. GTAP Data Base and model
3. Methodological approach
4. Policy scenarios
5. Results
6. Concluding remarks

# 1. Motivation

# Motivation

- **Agricultural and food systems contribute over 25% of global GHG emissions (FAO, 2018).**
  - For many countries they can represent even higher share.
- **Demographic changes and increasing income are expected to further push the global diet towards more meat-oriented and emission-intensive food items.**
  - According to Hedenus et al. (2014), food-related emissions could increase by over 80% between 2000 and 2070.
- **This alone would make it almost impossible to keep the global temperature increase *well below* 2°C, as desired by the Paris Climate Agreement.**
  - Reducing the food-related GHG emissions is a crucial component in meeting the stringent climate change targets.

# Overview of the existing literature

- Number of recent studies have explored environmental and health implications of strategies to reduce food-related GHG emissions:
  - Friel et al. (2009) showcase potential health benefits (reduction in ischemic heart diseases) from 50% reduction in agricultural and food-related emissions in Sao Paulo and UK. Agricultural tech improvements and reduction in livestock production is used as a main strategy.
  - Tilman and Clark (2014) explore environmental, health and land use implications of transitioning towards alternative diets (e.g. Mediterranean, pescatarian, vegetarian, etc.). They identify significant multiple benefits of such transitioning.
  - Springmann et al. (2016) focus on impacts of food-related GHG emissions taxation on health and environment. They report -9.3% reduction in food-related GHG emissions under \$52/tCO<sub>2</sub>. Significant health co-benefits (reduced mortality) are also identified.

***Drivers of the food-related GHG emissions reduction:***  
**productivity change vs taxation vs change in preferences**

# Focus of this study

- In this paper, we fill the gap in the existing literature, by focusing on following points:
  - Economy-wide (global and regional) implications of food-related emissions' taxation.
  - Sectoral impacts of food-related emission reductions.
  - Assessment of possible air-pollution reduction co-benefits.
  - Dietary implications.
  - Methodological developments that underlie such assessment.

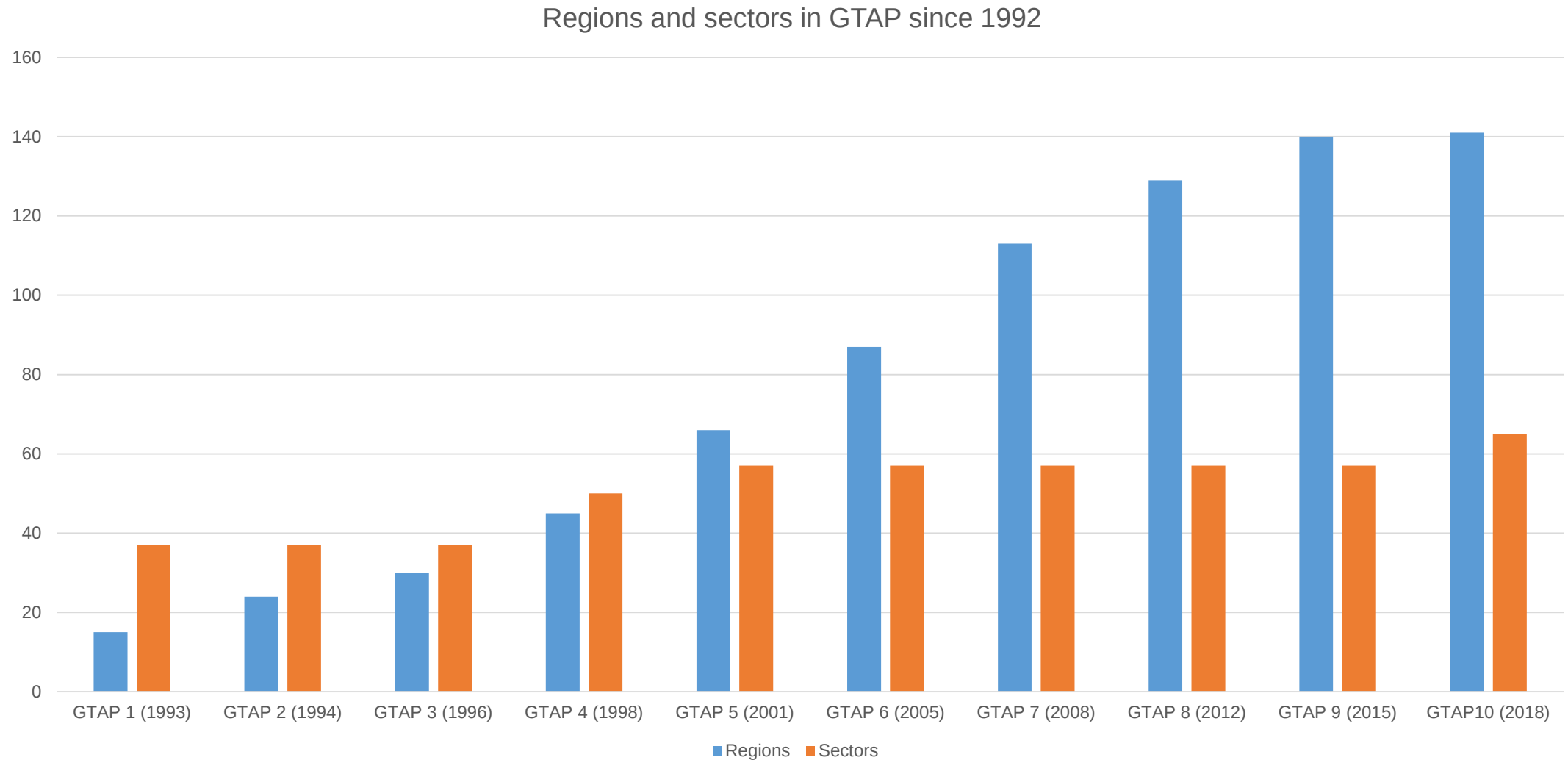
**Global Trade Analysis Project (GTAP) Database and multi-sector multi-region computable general equilibrium (CGE) model is used for such assessment**

## **2. GTAP Data Base and Model**

# What is GTAP?

- **Global Trade Analysis Project**
- **Based at Purdue University**
- **Consortium of international and government agencies, research institutes and universities, private sector**
- **International database for analysis of international policy issues**
  - Trade, migration, development, energy & the environment, etc.
- **Global GE model also available**
  - Model is known as the GTAP model and is coded using GEMPACK, see Hertel, Thomas, ed. (1997), *Global Trade Analysis: Modeling and Applications*, Cambridge University Press.

# Evolution of the GTAP Data Base



# Increasing Regional Coverage



GTAP 6 – 69 countries



GTAP 7 – 94 countries



GTAP 8 – 109 countries



GTAP 9 – 120 countries

# Commodity coverage v9 (57 sectors)

|                     |                     |                                |                     |                             |
|---------------------|---------------------|--------------------------------|---------------------|-----------------------------|
| Paddy rice          | Coal                | Wood products                  |                     | Communication               |
| Wheat               | Oil                 | Pulp, paper etc.               | Other mach. & eqpt. | Financial services          |
| Other cereals       | Gas                 | Refined oil etc.               | Other manu.         | Insurance                   |
| Vegetables & fruits | Other minerals      | Chemicals, rubber and plastics | Electricity         | Other bus. services         |
| Oil seeds           | Red meat            |                                | Gas distribution    |                             |
| Sugar cane & beet   | White meat          |                                | Water               | Recreation etc.             |
| Plant-based fibers  | Vegetable oils      | Other mineral prod.            | Construction        | Public Admin., Educ, Health |
| Other crops         | Dairy products      | Ferrous metals                 | Trade               |                             |
| Beef etc.           | Processed rice      | Other metals                   | Other transport     | Dwellings                   |
| Poultry, pork, etc. | Refined sugar       | Metal products                 |                     |                             |
| Raw milk            | Other food          | Mot. vehicles & parts          |                     |                             |
| Wool etc.           | Beverages & tobacco | Other trp. eqpt.               | Sea transport       |                             |
| Forestry            | Textiles            | Electronic eqpt.               | Air transport       |                             |
| Fishing             | Clothing            |                                |                     |                             |
|                     | Leather products    |                                |                     |                             |

# Commodity coverage v10 (65 sectors)

|                     |                     |                       |                     |                     |
|---------------------|---------------------|-----------------------|---------------------|---------------------|
| Paddy rice          | Coal                | Wood products         | Electrical eqpt.    | Communication       |
| Wheat               | Oil                 | Pulp, paper etc.      | Other mach. & eqpt. | Financial services  |
| Other cereals       | Gas                 | Refined oil etc.      | Other manu.         | Insurance           |
| Vegetables & fruits | Other minerals      | Pharmaceuticals       | Electricity         | Real estate         |
| Oil seeds           | Red meat            | Other chemicals       | Gas distribution    | Other bus. services |
| Sugar cane & beet   | White meat          | Rubber & plastics     | Water               | Recreation etc.     |
| Plant-based fibers  | Vegetable oils      | Other mineral prod.   | Construction        | Public Admin.       |
| Other crops         | Dairy products      | Ferrous metals        | W & R trade         | Education           |
| Beef etc.           | Processed rice      | Other metals          | Hotels, rests. etc. | Health              |
| Poultry, pork, etc. | Refined sugar       | Metal products        | Warehousing etc.    | Dwellings           |
| Raw milk            | Other food          | Mot. vehicles & parts | Land transport      |                     |
| Wool etc.           | Beverages & tobacco | Other trp. eqpt.      | Sea transport       |                     |
| Forestry            | Textiles            | Electronic eqpt.      | Air transport       |                     |
| Fishing             | Clothing            |                       |                     |                     |
|                     | Leather products    |                       |                     |                     |

# GTAP Data Base Release History

| Release  | Released | Regions | Sectors | Reference Years        |
|----------|----------|---------|---------|------------------------|
| GTAP 1   | 1993     | 15      | 37      | 1990                   |
| GTAP 2   | 1994     | 24      | 37      | 1992                   |
| GTAP 3   | 1996     | 30      | 37      | 1992                   |
| GTAP 4   | 1998     | 45      | 50      | 1995                   |
| GTAP 5   | 2001     | 66      | 57      | 1997                   |
| GTAP 6   | 2005     | 87      | 57      | 2001                   |
| GTAP 7   | 2008     | 113     | 57      | 2004                   |
| GTAP 8.1 | 2012     | 134     | 57      | 2004, 2007             |
| GTAP 9a  | 2016     | 140     | 57      | 2004, 2007, 2011       |
| GTAP 10  | 2019     | 141     | 65      | 2004, 2007, 2011, 2014 |

# Structure of the GTAP Data Base

- **National input/output tables**
- **Bilateral trade and protection data**
  - Export taxes/subsidies
  - International trade and transport margins (FOB, CIF)
  - Bilateral import tariffs
- **Other international data sources**
  - Macro
  - Agriculture
  - Energy
- **“FIT” procedure to make consistent world accounting framework**

# Satellite accounts

## ■ Standard

- Times series of bilateral merchandise trade flow (199x-201x)
- Energy consumption in MTOE and CO<sub>2</sub> emissions from fuel combustion

## ■ Additional

- Bilateral stock of foreign-born population and workers (by skill)
- Cross-border flows of capital income
- Emissions of other greenhouse gases (N<sub>2</sub>O, CH<sub>4</sub>, F-gases)
- Air pollution (10 air pollutants)
- Land use (18 agro-ecological zones—AEZs) and forestry coverage

## ■ Special databases

- Power database (electricity production split into 11 sources (thermal, nuclear, hydro, renewables, etc.) + transmission & distribution)
- Water database (rain-fed and irrigated crops, aggregate water use for livestock, municipal and industrial)
- Energy subsidies database (country-specific fossil-fuel consumption subsidies)

# GTAP Model

- Multi-region static computable general equilibrium (CGE) model
- Describes the global economy which consists of many economies
- Trade links the economies
  - Track exports by commodity, source and destination, domestic vs imported
- **Armington assumption:** product differentiation by country of origin
- **Each region is balanced**
  - $S - I = X - M$
- **World is balanced**
  - Global Saving = Global Investment
  - Total Exports = Total Imports

# GTAP Model

- **Standard Features**

- Perfect competition and constant returns to scale
- Comparative static: No dynamics, No endogenous capital accumulation
- Bilateral trade specified via Armington assumption

- **Non-Standard Features**

- Private demand for commodities and services derived from a Constant Difference Elasticity (CDE) function
- Regional Household collects all income and allocates across private consumption, government and saving
- Sluggish primary factors
- Explicit treatment of transportation costs in int'l trade via a global transport sector
- Global investments linked to global savings via a global bank

# GTAP Model

- **Accounting relations and price linkages**
  - Market clearing equations
  - Supplies and demands for domestic goods, imports, endowments, investment goods and transport
  - Regional household – allocation of income
  - Zero profits equation
  - Linking market prices to those paid by consumers, government, investors, firms and importers
- **Behavioral equations**
  - Consumer Behavior/Demand
  - Producer Behavior/Supply

# **3. Methodological Approach**

# General Framework

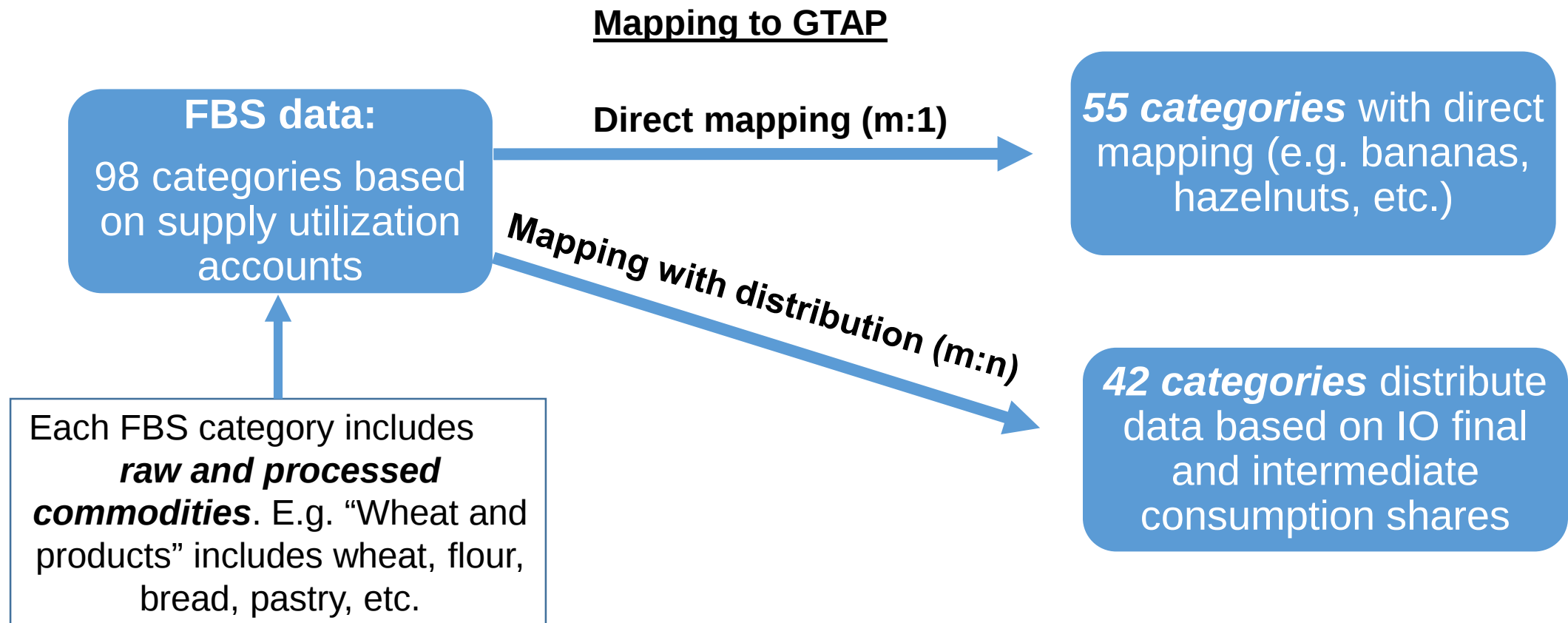
- **Static computable general equilibrium model (GTAP-E)**
- **GTAP 9.2 Database (2011 reference year)**
- **Data extensions:**
  - *FAO-based agricultural production targeting (APT)*. Covers 133 regions of the GTAP Database.
  - *GTAP-consistent food balance sheets* with dietary and nutritional information. Allows to track changes in food, fat and protein supply.
  - Include the *non-CO<sub>2</sub> GHG* emissions and *air pollution* accounts.
- **Policy scenario:**
  - \$35/ton CO<sub>2</sub>-eq. (\$2010 PPP) tax of GHG emissions embodied into final households' consumption of food products.
  - Sensitivity analysis with tax lower bound of \$15/ton CO<sub>2</sub> and an upper bound of \$55/ton CO<sub>2</sub>.

# FAO-based APT: Motivation

- **Detailed representation of the agricultural sector in GTAP:**
  - Agricultural and food IO table is used to split sectors if required (Peterson, 2016).
  - Agricultural production targeting (APT) for 12 agricultural sectors is applied to selected countries, using OECD (OECD, 2017) and EU data (Boulanger et al., 2016).
- **Limitations of the current APT approach:**
  - OECD-derived data include high share of unclassified commodities (40% in case of China).
  - APT covers 46 countries (70% of global agricultural output), but misses most developing countries (e.g. India).
  - Some agricultural commodities are not reported by OECD and food output is used for targeting (e.g. sugar output is used to derive targets for sugar cane).
- **FAO reports 286 commodities for 217 countries (133 GTAP regions) with available price and quantity data**

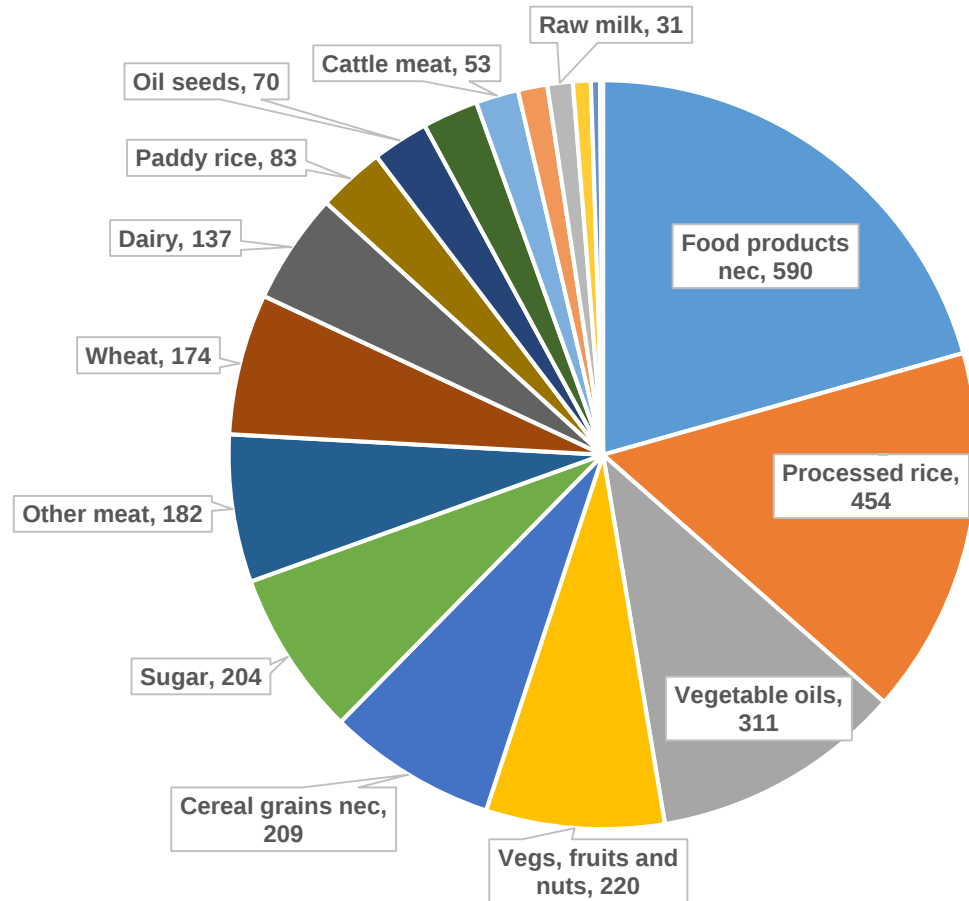
# Dietary and Nutritional Data: Construction

- *Key motivation* – track changes in food, fat and protein supply following implementation of carbon tax.
- Main data source – FAO Food Balance Sheets (FBS).

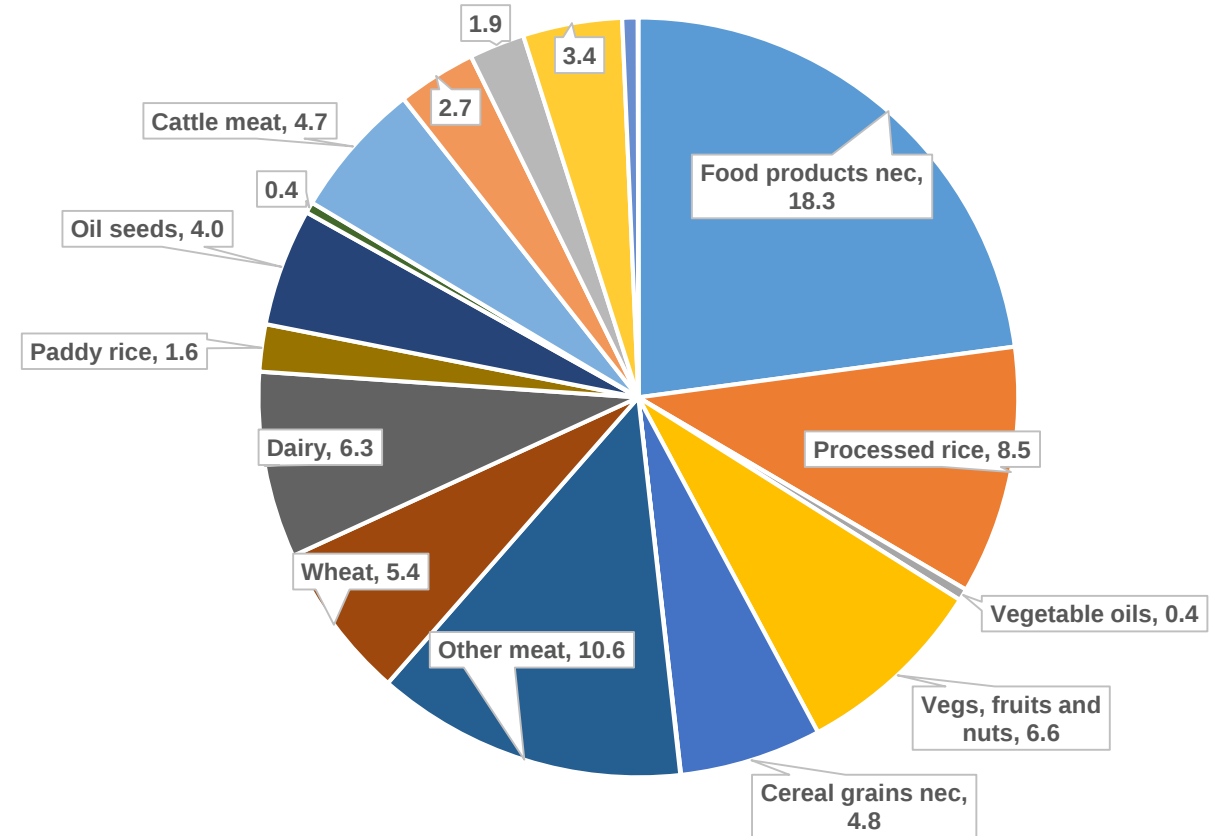


# Nutritional Data: Sectoral Distribution

Food supply (kcal/capita/day): global average is 2860 kcal/cap/day

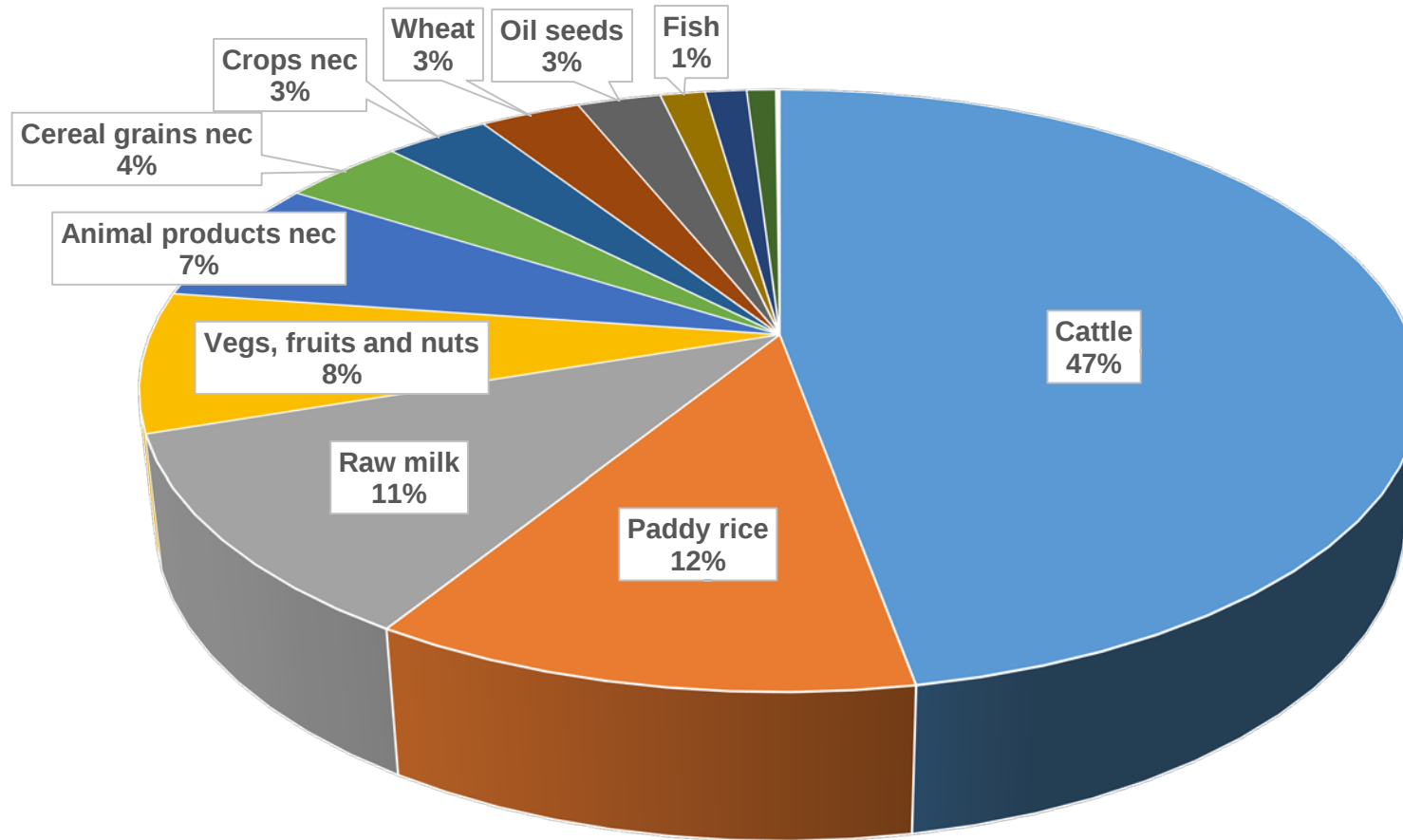


Protein supply (g/capita/day)



Global weighted average per capita distribution of food and protein supply by GTAP food and agricultural sectors

# Non-CO<sub>2</sub> GHG emissions (direct accounting)



Non-CO<sub>2</sub>-GHG emissions redistribution by GTAP sectors, 2011

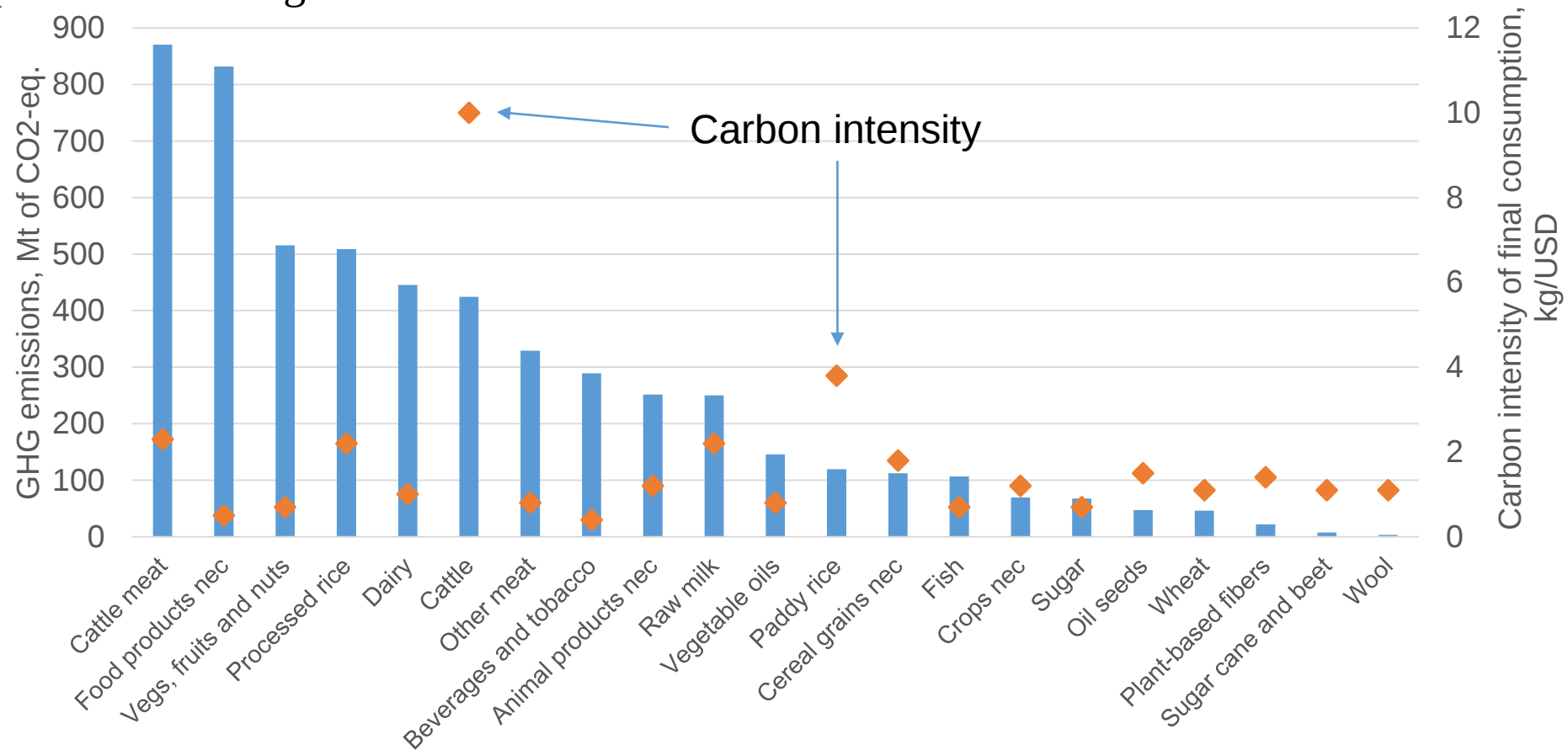
- Emissions of N<sub>2</sub>O, CH<sub>4</sub> and F-gases are linked to three types of drivers (intermediate and final consumption, endowment and output). Based on Irfanoglu and van der Mensbrugghe (2015).

# GHGs Embodied into Food Final Consumption

*GHGs embodied into final households' consumption* of region  $r$  ( $f_r$ )

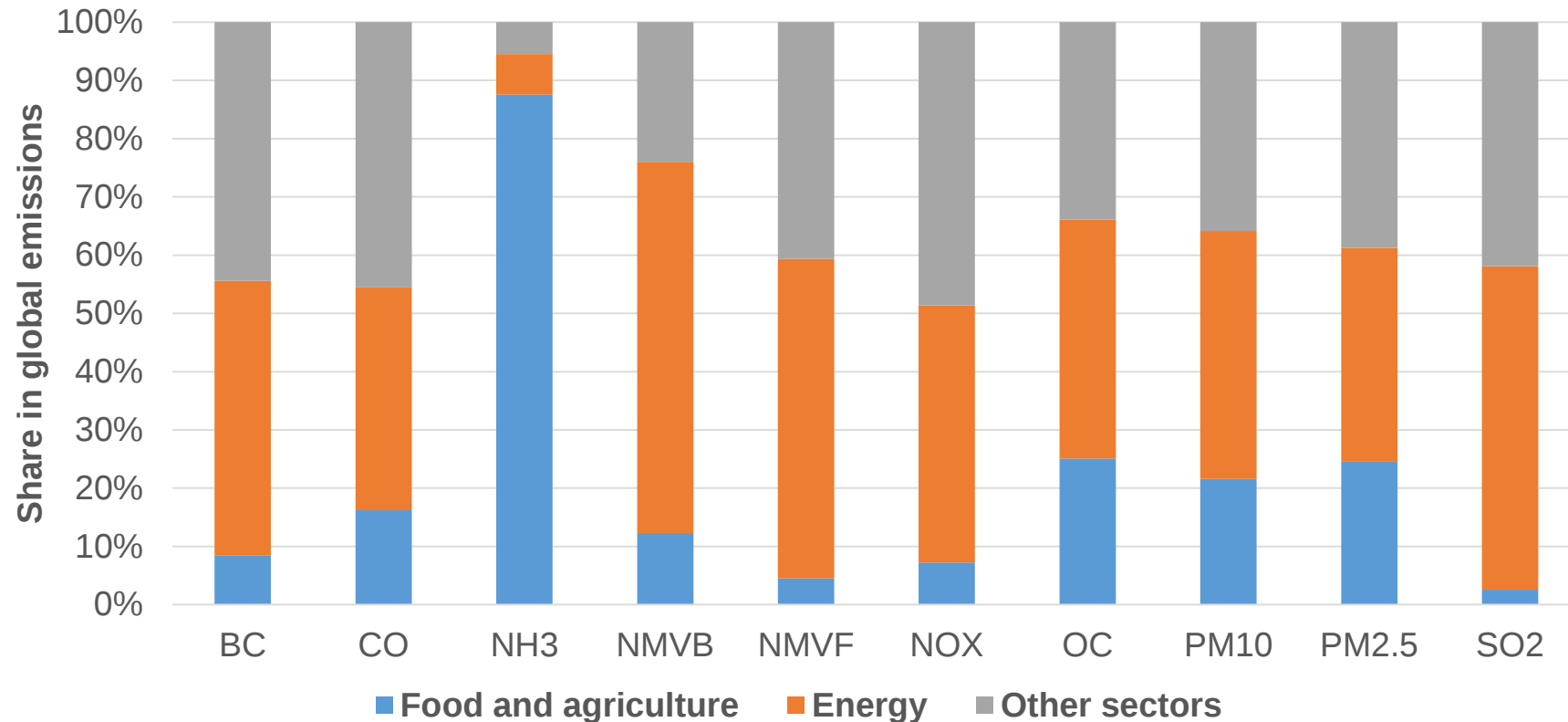
$$f_r = F_r(I - A_r)^{-1}e_r$$

where  $F_r$  is a vector of country-specific GHG emissions per unit of output by sectors,  $I$  is the identity matrix,  $A_r$  is the technological matrix for region  $r$  and  $e_r$  corresponds to the final households' consumption value in region  $r$ .



# Air Pollutants

- Complement the modelling framework with *air pollution accounts*.
- This allows us to *estimate potential air pollution co-benefits* from emissions taxation.
- Emissions *are linked to the three groups of drivers* (consumption, endowment and output).



**Global emission shares by aggregate sectors and air pollutants**

Source: Based on Chepeliev (2018).

## **4. Policy Scenarios**

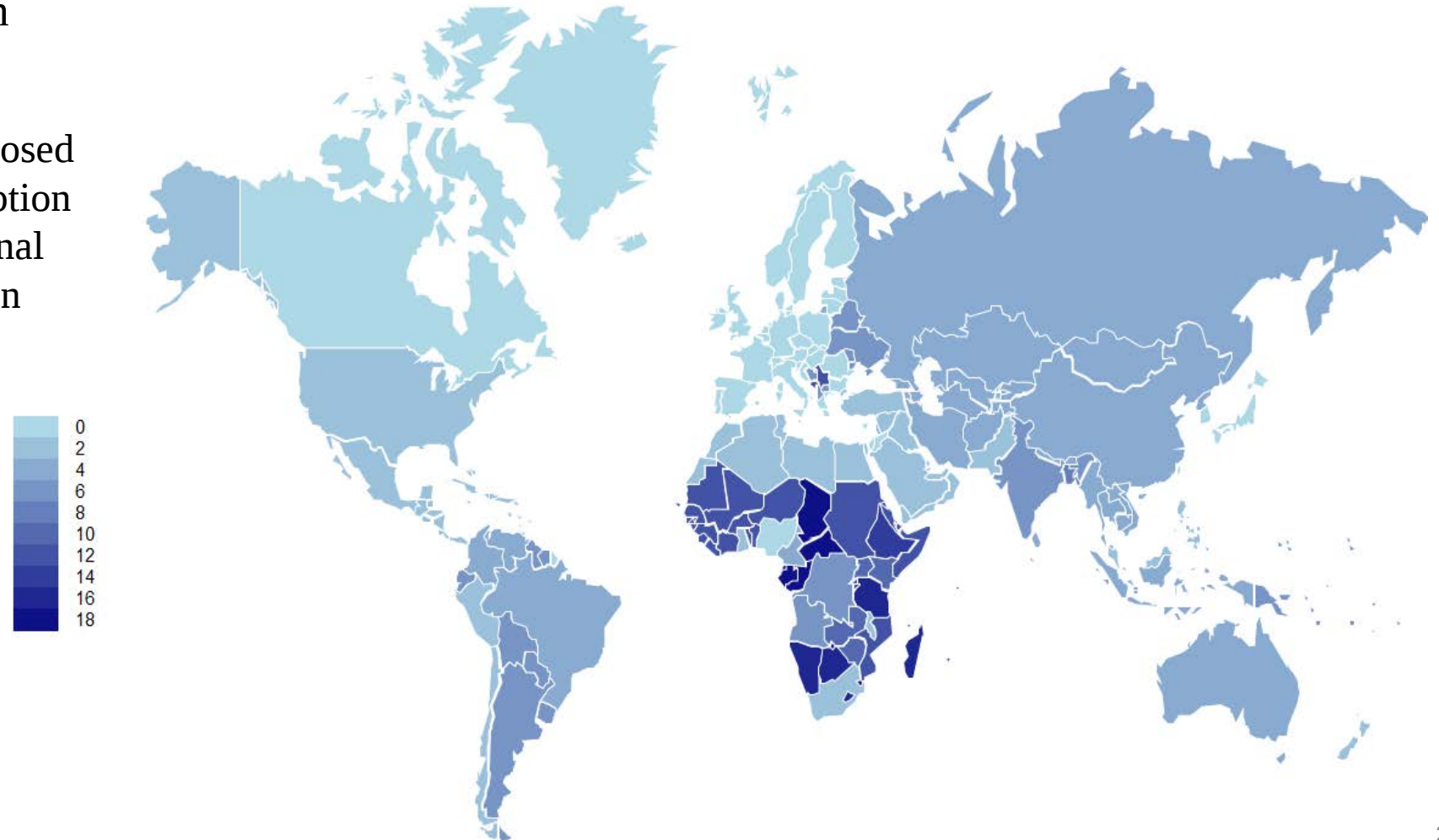
# Policy Scenario

- Impose carbon tax on GHG emissions embodied into final households' consumption of food and agricultural commodities.
- Central value of \$35/ton CO<sub>2</sub>-eq. (\$2010 PPP), along with a lower bound of \$15/ton CO<sub>2</sub>-eq. and an upper bound of \$55/ton

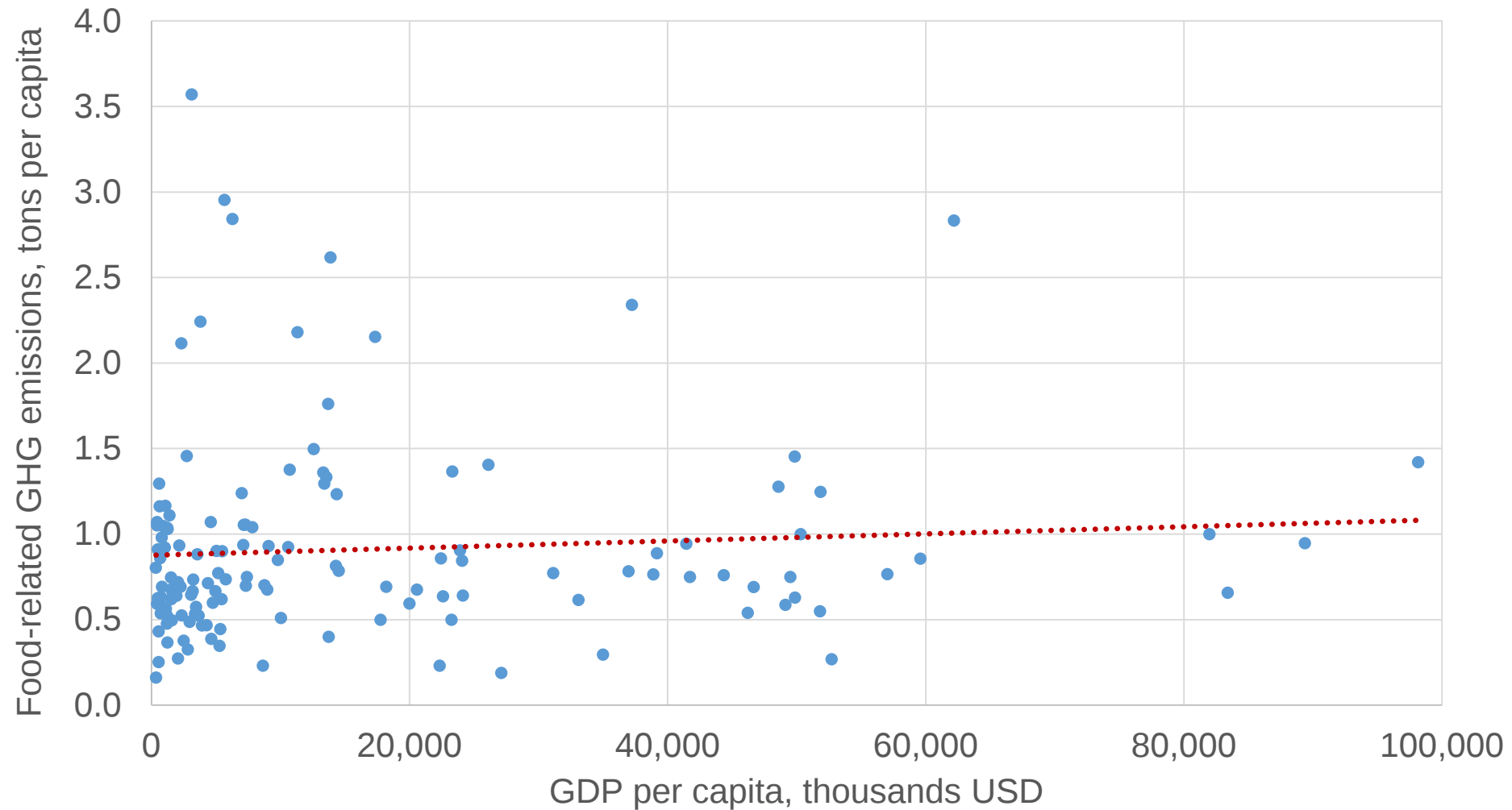
Region-average tax rates imposed on final households' consumption of food commodities, % of final households' food consumption value.

## ***Sectoral patterns:***

Cattle meat faces the highest tax rate (36.3%), followed by Paddy rice (13.7%), Cattle meat (8.3%), Raw milk (8%) and Processed rice (7.8%).



# Food-related GHGs vs GDP



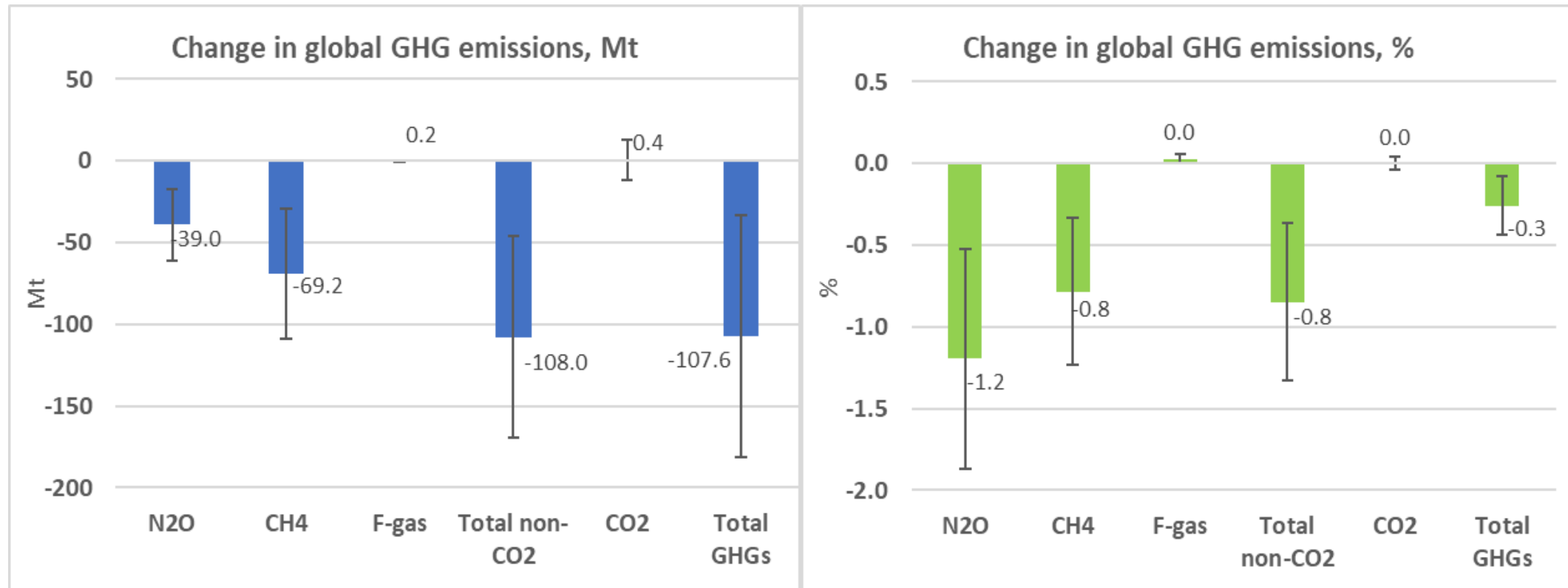
Drivers towards higher level of households' final expenditure on food in advanced economies are only partially offset by lower food-related emissions per capita in developing countries.

# Modelling framework

- **Static CGE** model (GTAP-E) with **2011 reference** year
- Aggregation: **64 regions and 35 sectors**.
- **Non-CO<sub>2</sub> GHGs** and air pollutants are linked to three types of drivers (final and intermediate consumption, endowment and output).
- Dietary and nutritional changes are linked to changes in households' food consumption.
- **Limitations:**
  - Have not imposed taxes and mapped nutrition data to the accommodation and food service activities (is aggregated with trade in GTAP 9.2; less than 5% of global non-CO<sub>2</sub> GHG emissions; would be a separate sector in GTAP 10).

# 5. Results

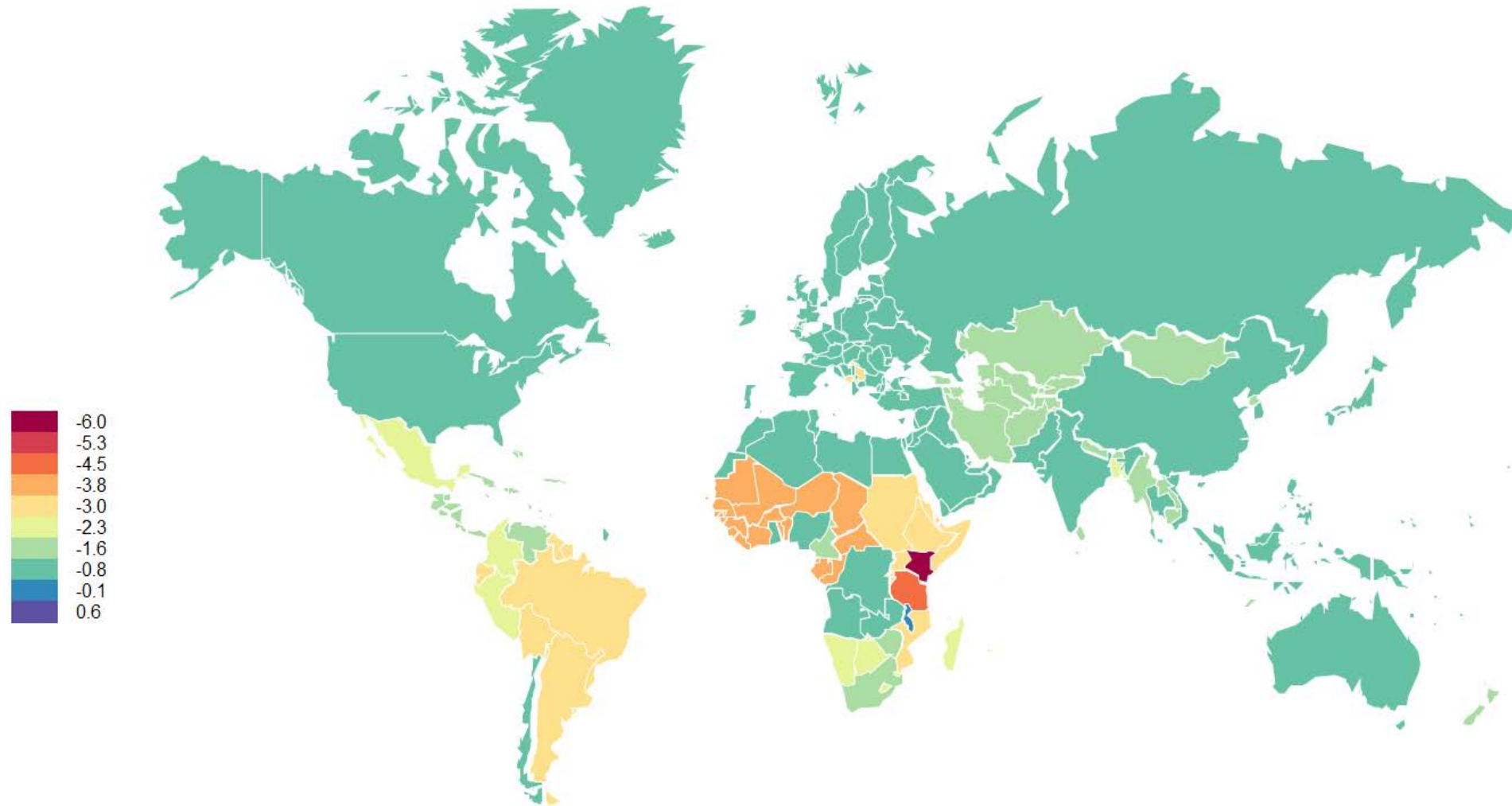
# Changes in Global GHG emissions



**Changes in global GHG emissions following imposition of carbon tax on food products, relative to 2011 levels**

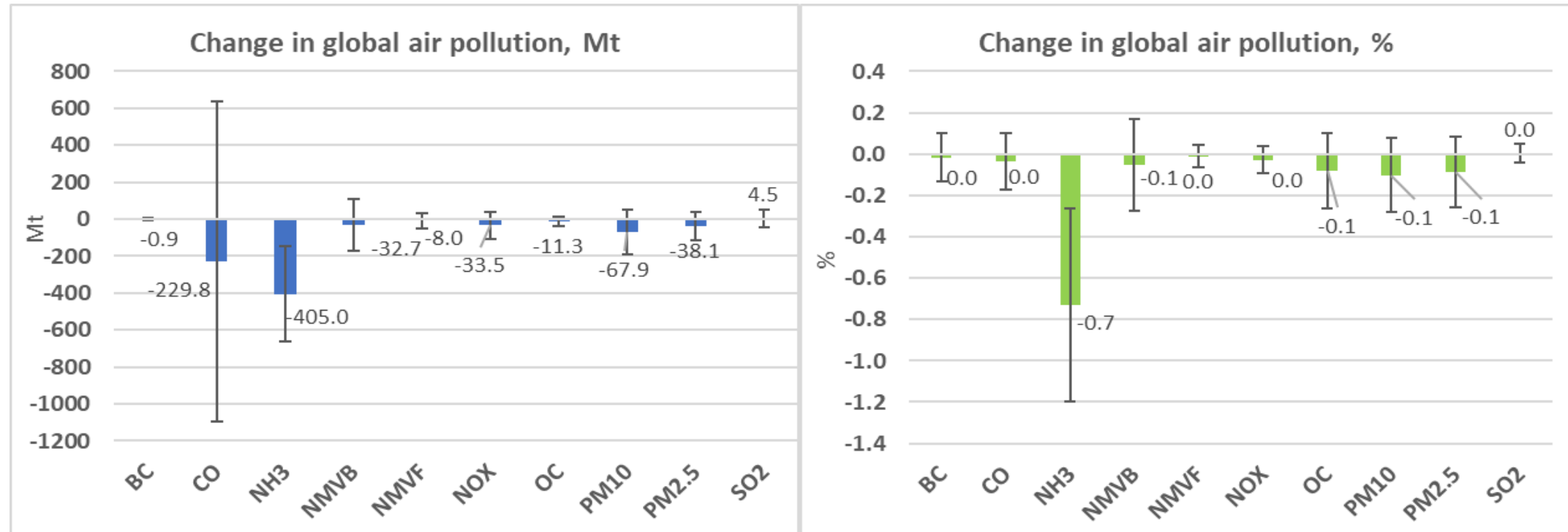
*Note:* Error bars indicate 95% confidence intervals following variation in emission tax rates between \$15/ton CO<sub>2</sub>-eq. and \$55/ton CO<sub>2</sub>-eq.

# Changes in Regional GHG emissions



**Changes in aggregate non-CO2 GHG emissions by regions following imposition of carbon tax on food products, % relative to 2011 levels**

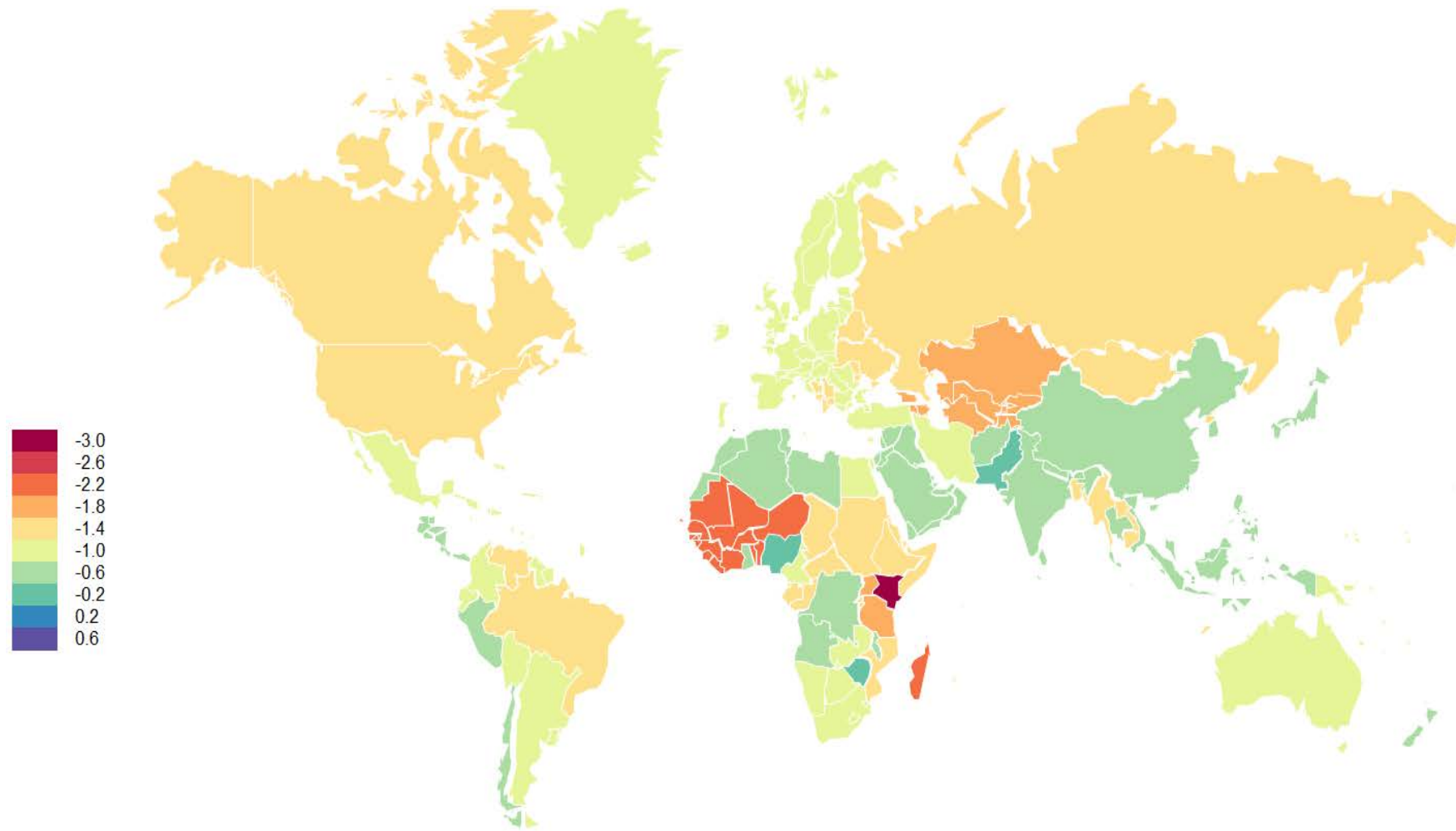
# Changes in Air Pollution



**Changes in global air pollution levels following imposition of carbon tax on food products, % relative to 2011 levels**

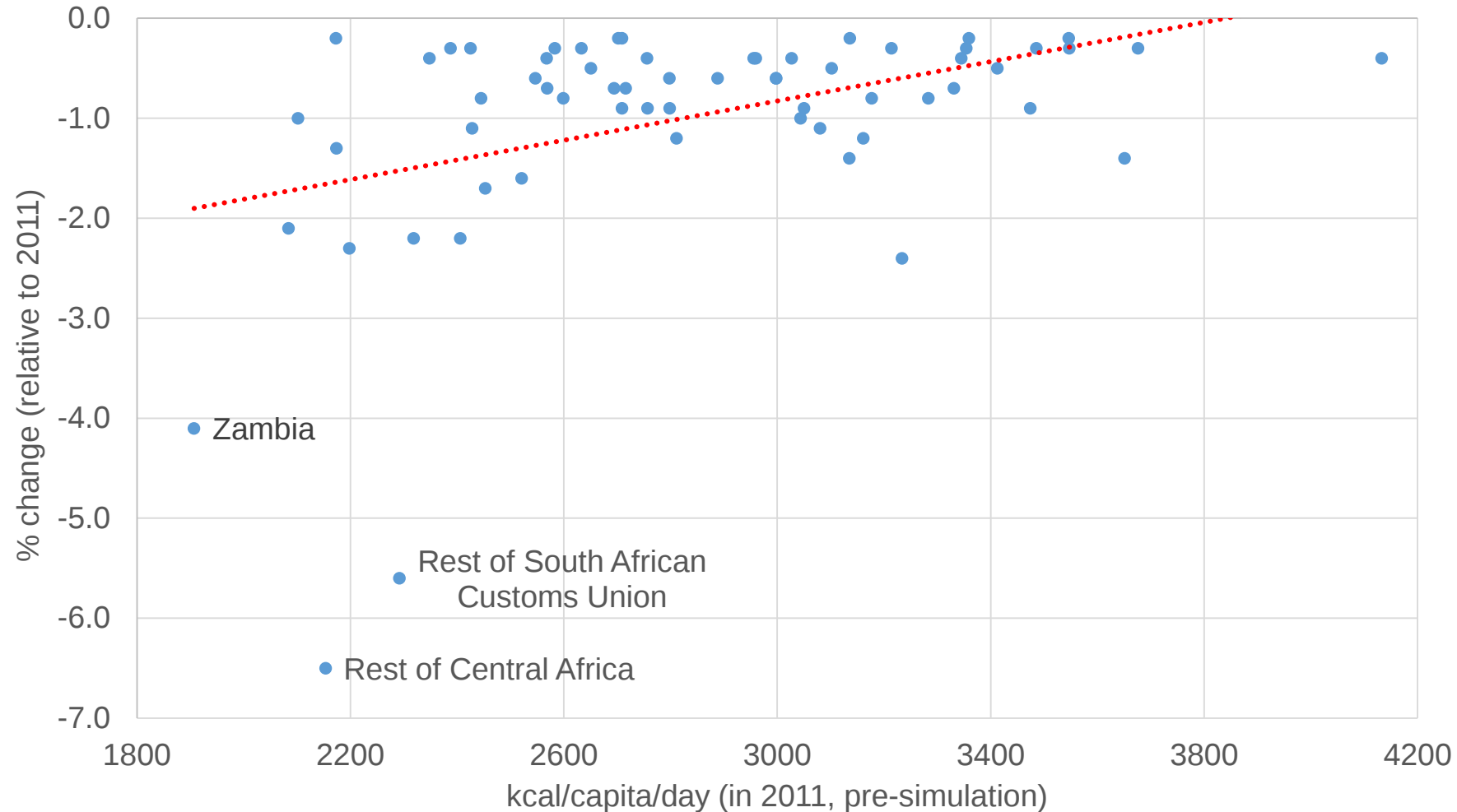
*Note:* Error bars indicate 95% confidence intervals following variation in emission tax rates between \$15/ton CO<sub>2</sub>-eq. and \$55/ton CO<sub>2</sub>-eq.

# Changes in NH<sub>3</sub> emissions by regions



**Change in NH<sub>3</sub> emissions by regions following imposition of carbon tax on food products, % relative to 2011 levels**

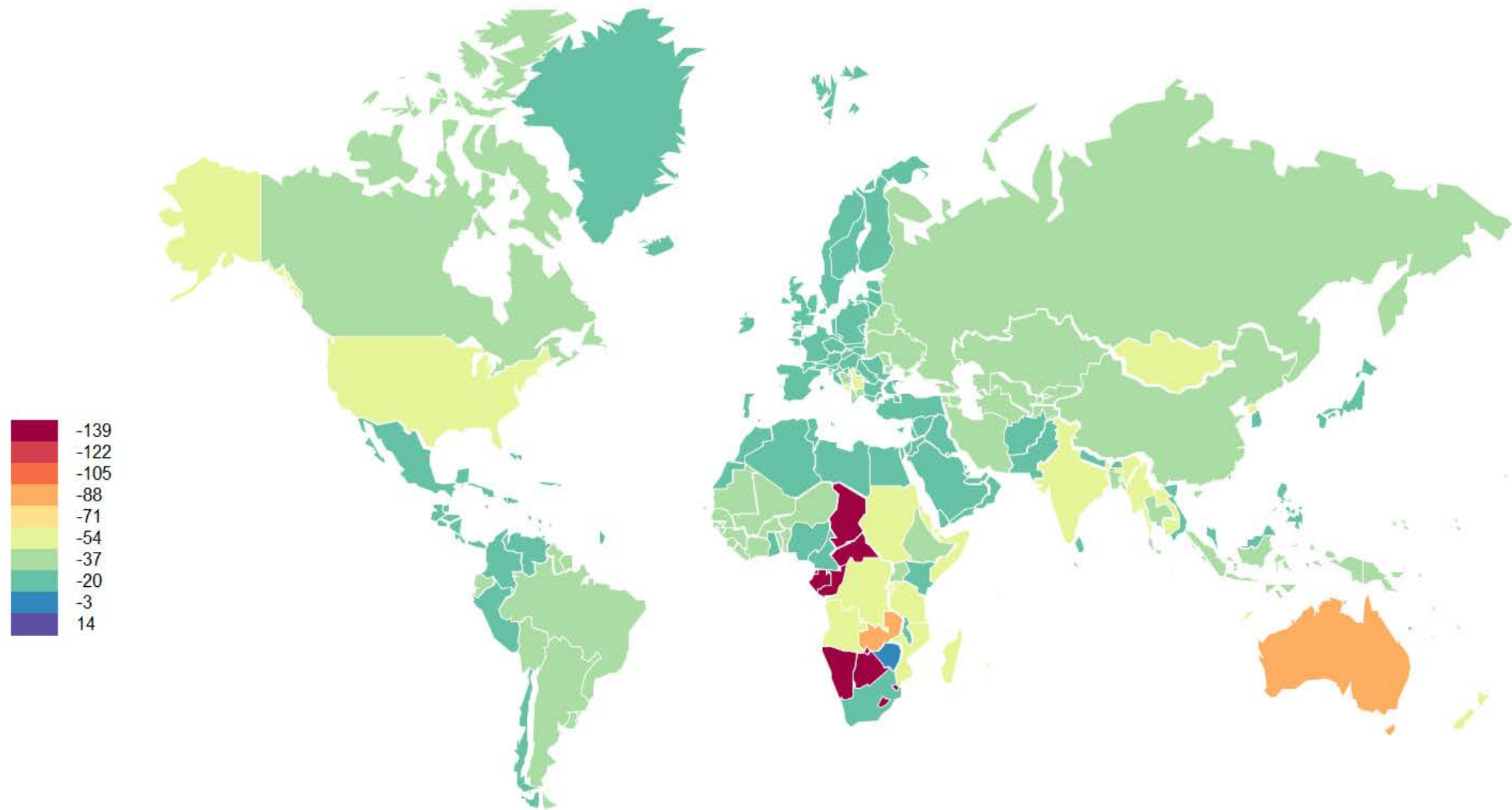
# Changes in food supply



**Changes in food supply by regions following imposition of carbon tax on food products, % relative to 2011 levels**

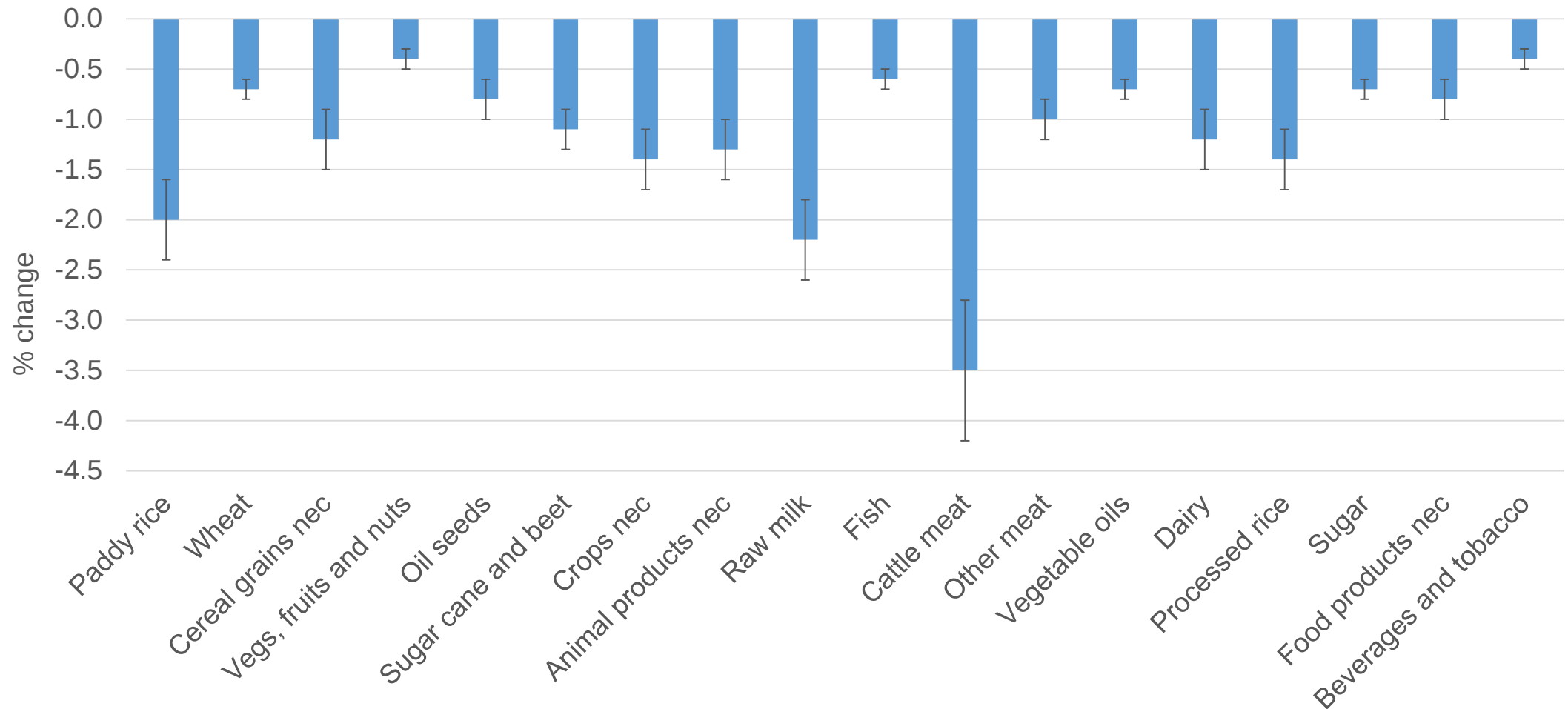
*Note:* Each point corresponds to one aggregate region.

# Changes in food supply by regions



**Changes in food consumption by regions following imposition of carbon tax on food products relative to 2011 levels, g/capita/day**

# Changes in food supply by sectors

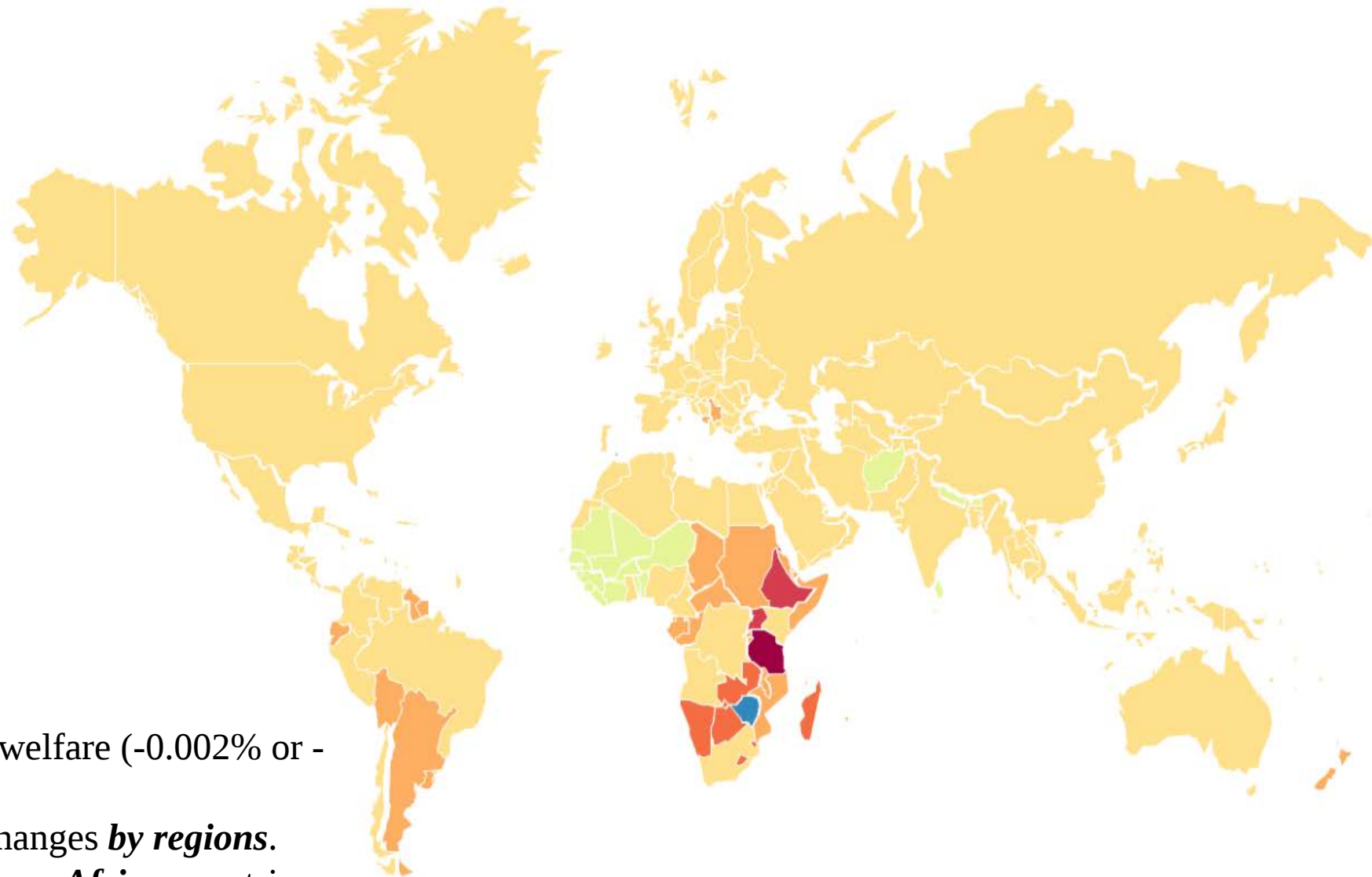
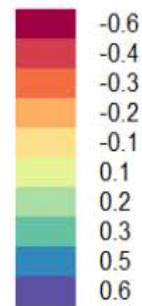


## Changes in global food supply by sectors, % relative to 2011 levels

*Note:* Error bars indicate 95% confidence intervals following variation in emission tax rates between \$15/ton CO<sub>2</sub>-eq. and \$55/ton CO<sub>2</sub>-eq.

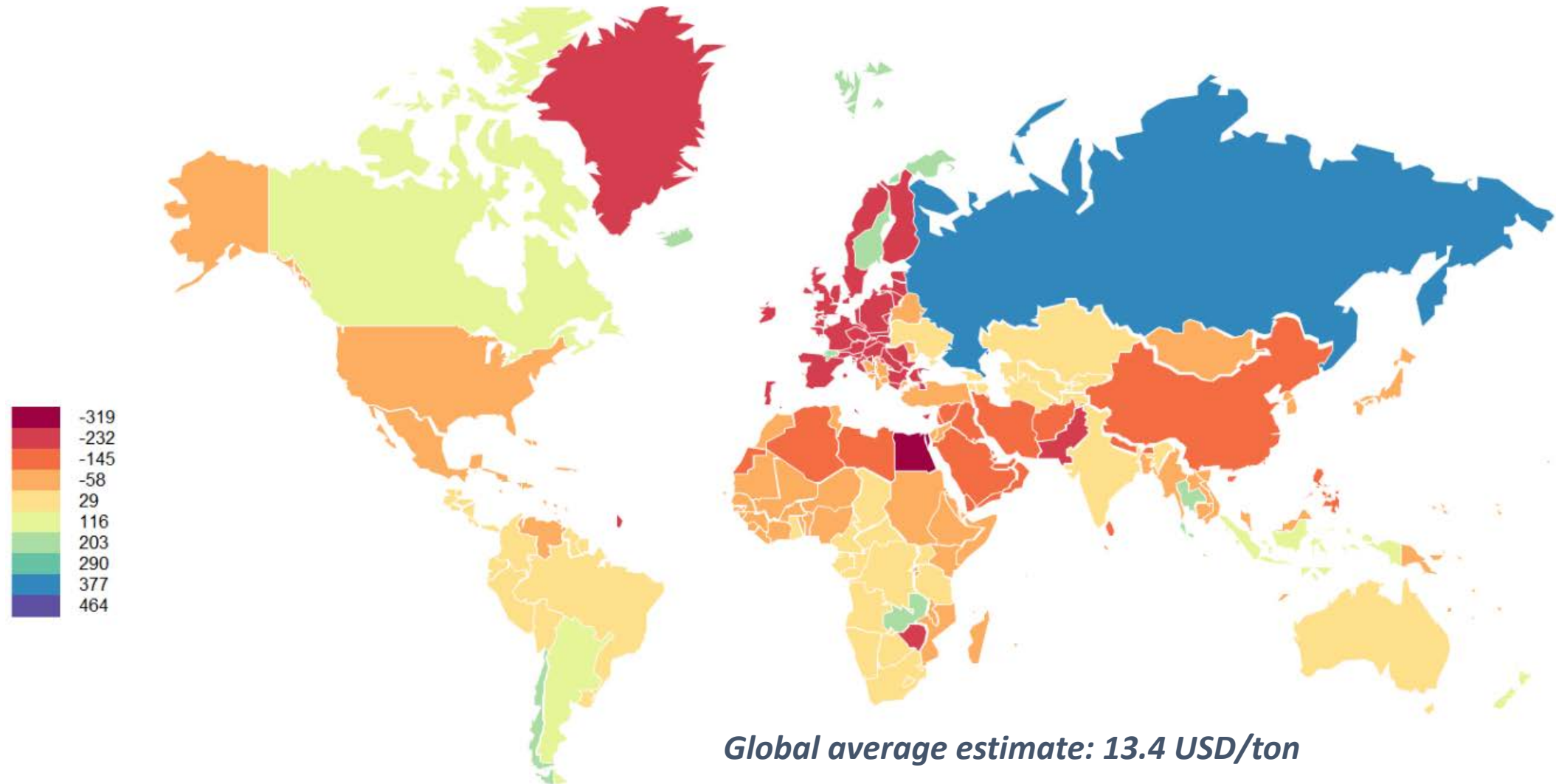
# Welfare change, %

In our model carbon taxes are collected by **Representative Agent** (includes all final consumer)



- ***Insignificant impacts*** on global welfare (-0.002% or - \$1.4 billion).
- ***Moderate variation*** in welfare changes ***by regions***.
- ***Largest reductions in Sub-Saharan Africa*** countries (over -0.4% in the cases of Uganda and Tanzania).

# Welfare costs per ton of aggregate GHG emissions reduction, \$/ton CO<sub>2</sub>-eq.



*Note:* Only countries with aggregate GHG emissions reduction below -0.1% are used to estimate the cost of reduction. Negative values imply that welfare is increasing, while GHG emissions are falling.

# Summary

## Moderate impacts on food-related emissions reduction:

- 0.8% (0.4%-1.3%) reduction in non-CO<sub>2</sub> GHGs under \$35/ton-CO<sub>2</sub>-eq.
- 0.3% reduction in global GHGs.
- Limited co-benefits from air pollution changes (-0.7% for NH<sub>3</sub>, insignificant for other gases).
- Average welfare costs of reduction: \$13.4/ton CO<sub>2</sub>-eq. (highly vary by regions)

## Dietary and welfare impacts:

- Regressive dietary consequences for developing countries.
- Cattle meat, Raw milk, Paddy rice and Processed rice – food supply reductions.
- Small global welfare changes (-0.002% or \$1.4 bn), but large regional variations.

# Discussion

## Further improvements:

- Improve dietary and nutritional data representation and mapping.
- Move to a newer version of GTAP database (GTAP 10) with more detailed sectoral structure and 2014 reference year.
- Link CGE model to PE model with disaggregated agricultural and food commodities representation (e.g. 79 vegetables fruits and nuts in GTAP-HS).
- Compare results with production-based taxation scenarios.
- Explore trade implications of food-related emission taxation.
- Sensitivity analysis w.r.t. substitution elasticities.

## Comparison with other studies:

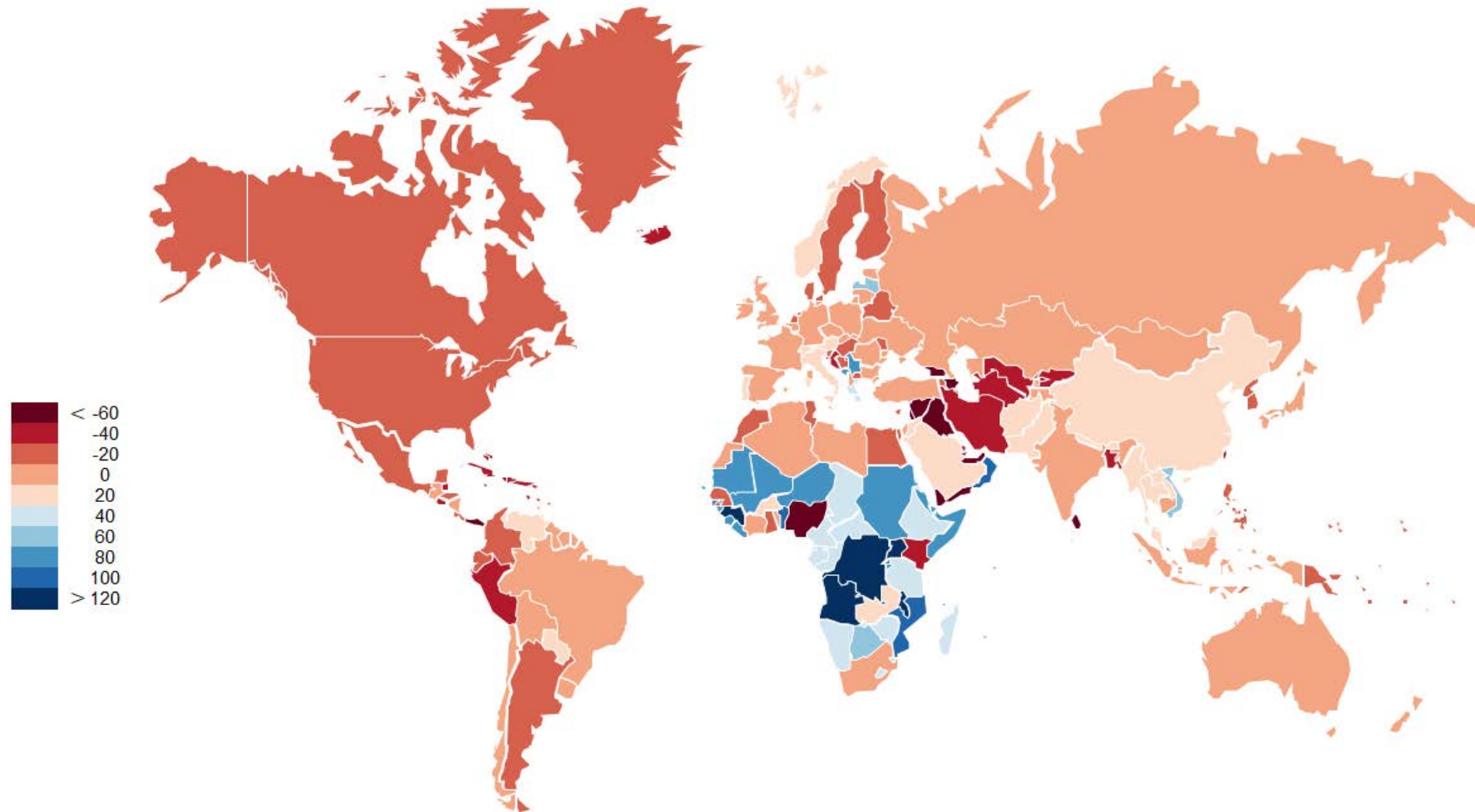
- Our estimates suggest much smaller reductions than some of the existing studies (e.g. Springmann et al. report -9.3% in food GHG emissions under \$52/ton tax).



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# Thank you!

# FAO-based APT: Results



**Difference between aggregate agricultural output in the GTAP 9.2 with FAO-based APT and standard GTAP 9.2, %**

*Source:* Chepeliev and Aguiar (2018).