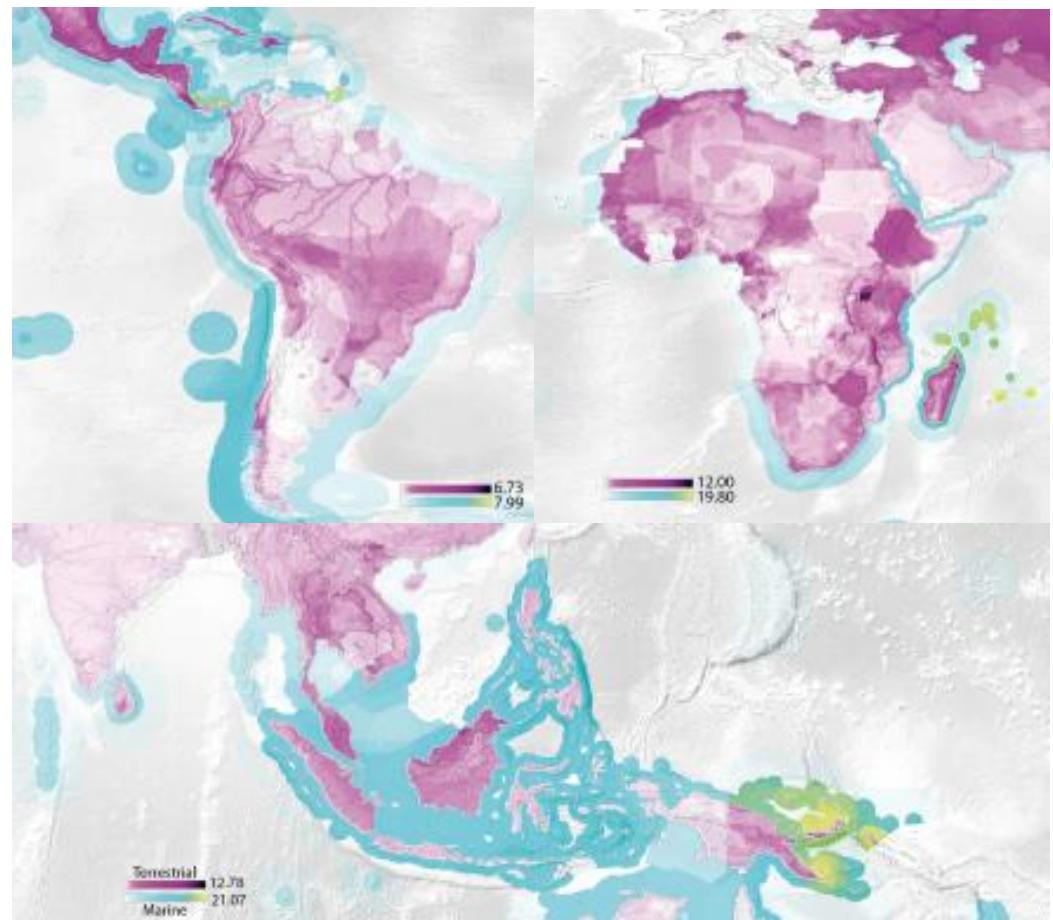


# Spatial MRIO Footprints

Daniel Moran  
NTNU

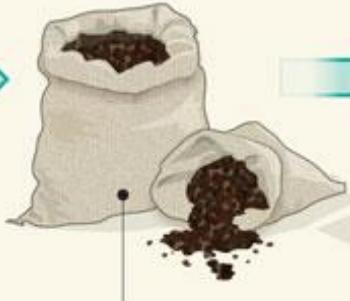




Consumption



Production



Pressures



Environment



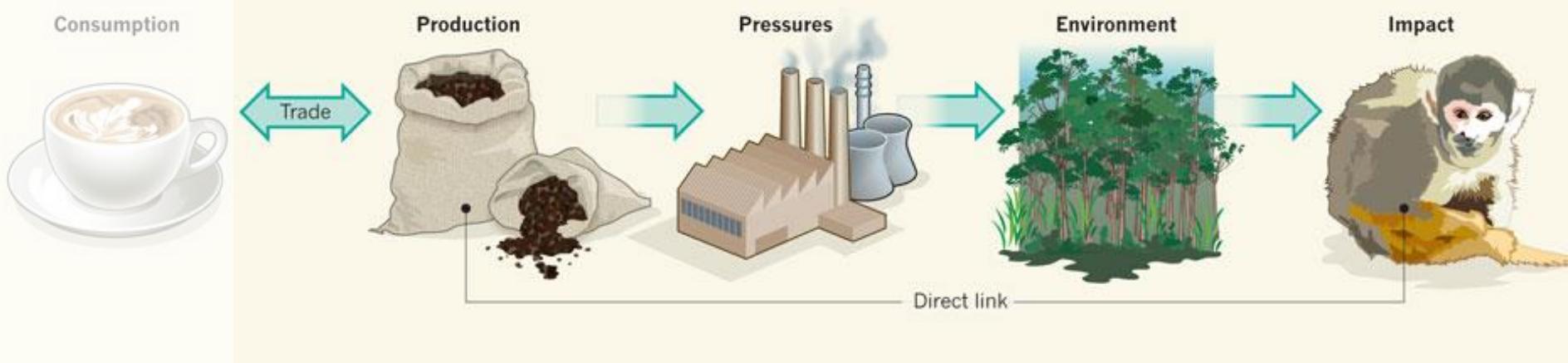
Impact



Trade



Direct link



# FAO Commodity Balance Sheets (CBS)

Signal Probabilities

$$p_k^m = \frac{q_k^m}{\Omega_k(\lambda_t)} \exp[\alpha_k^m \sum_t g_{kt} \lambda_t]$$

Noise Probabilities

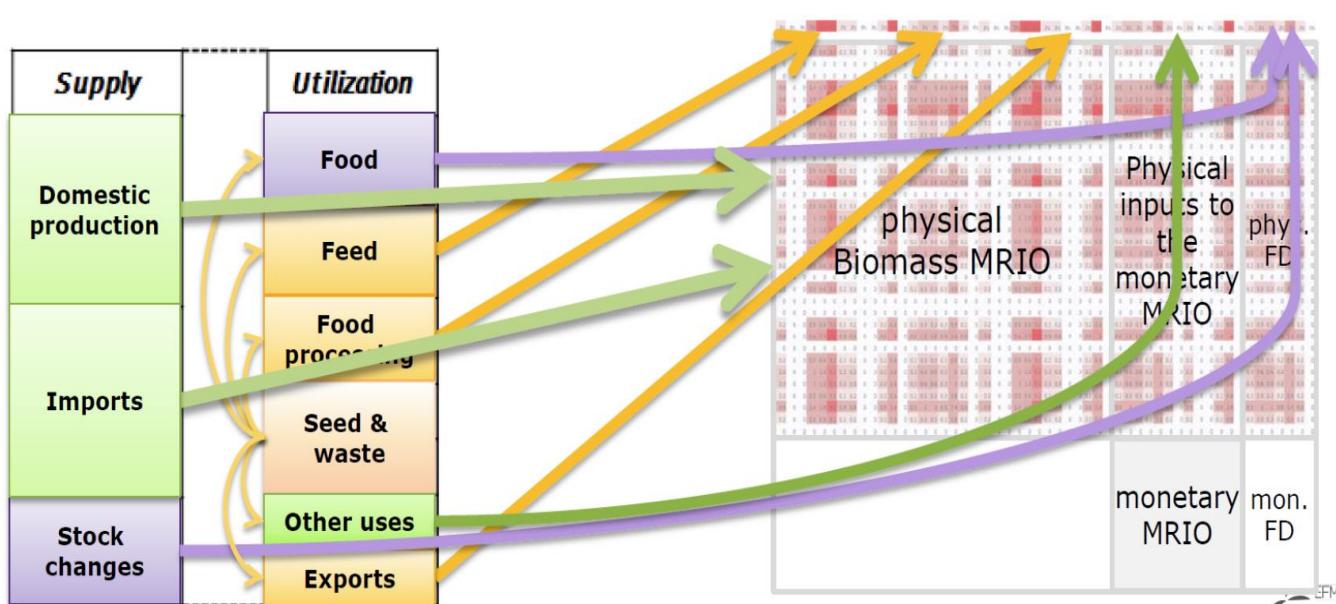
$$w_t^v = \frac{u_t^v}{\Psi_t(\lambda_t)} \exp[\beta_t^v \lambda_t]$$

Normalization Factors: Partition Functions

$$\Omega_k(\lambda_t) = \sum^m q_k^m \exp[\alpha_k^m \sum_t g_{kt} \lambda_t]$$

$$\Psi_t(\lambda_t) = \sum^v u_t^v \exp[\beta_t^v \lambda_t]$$

$\lambda_t$  = Langrangian Multipliers





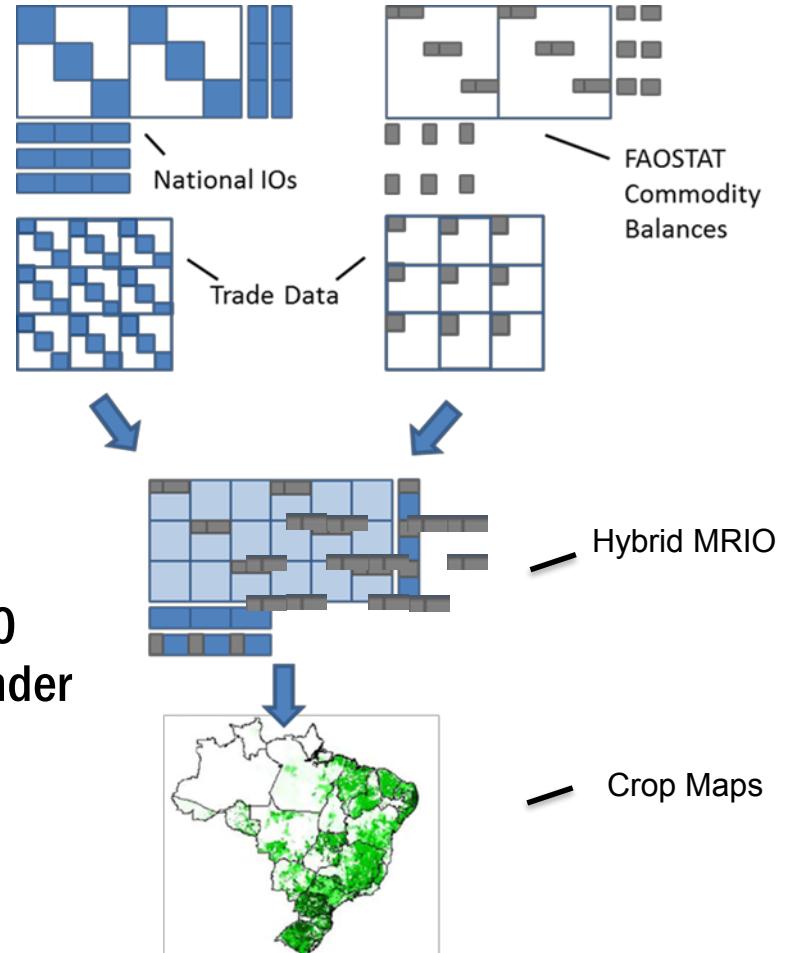
# Landuse Footprints of Agricultural Products

## Connection between Crop Maps and Supply Chain Information

- Shortcomings of pure monetary and pure physical accounting approaches
- Hybrid MRIO linked with crop maps

## Main Data Sources:

- Monetary layer: EXIOBASE3
- Physical layer: Physical Biomass MRIO for 130 products covering 175 countries. (currently under construction by M. Bruckner)
- Bilateral trade data (BACI)



# FAO: Process chain description



ESSB  
COMMODITY TREE No.26

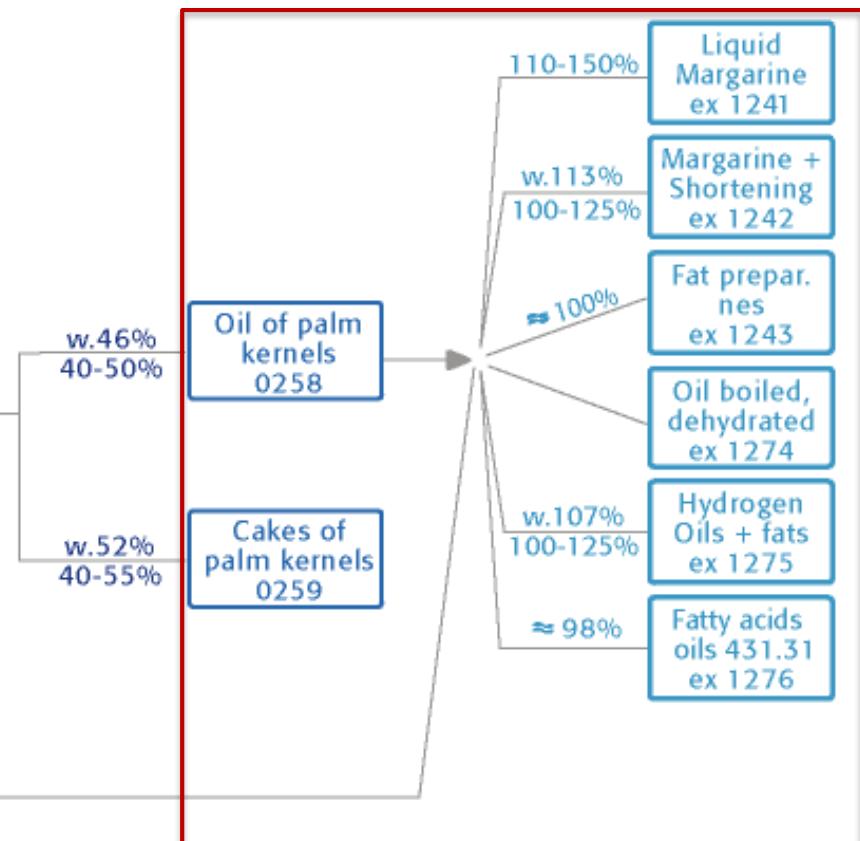
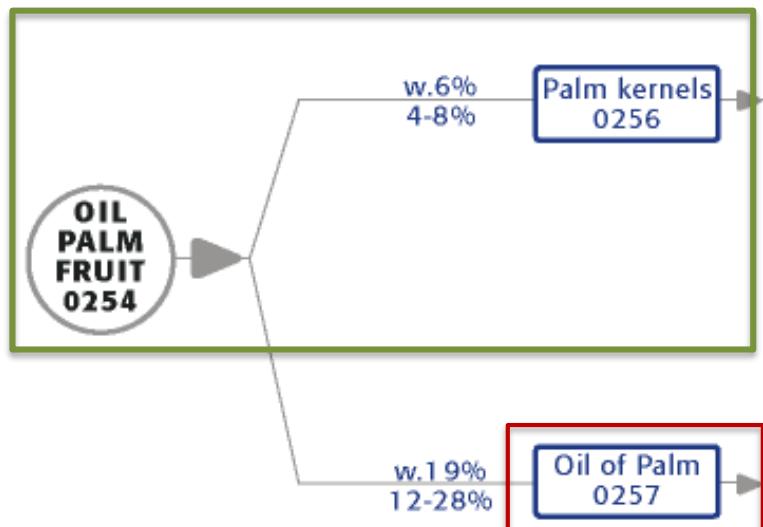
1st Level

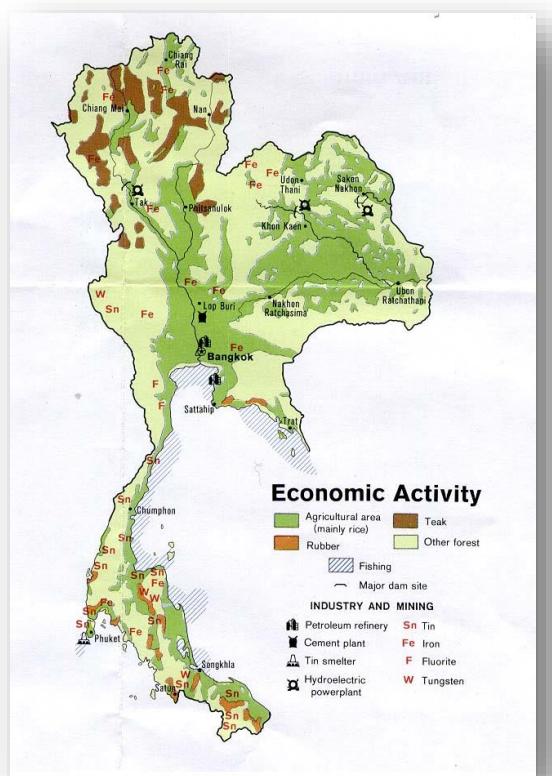
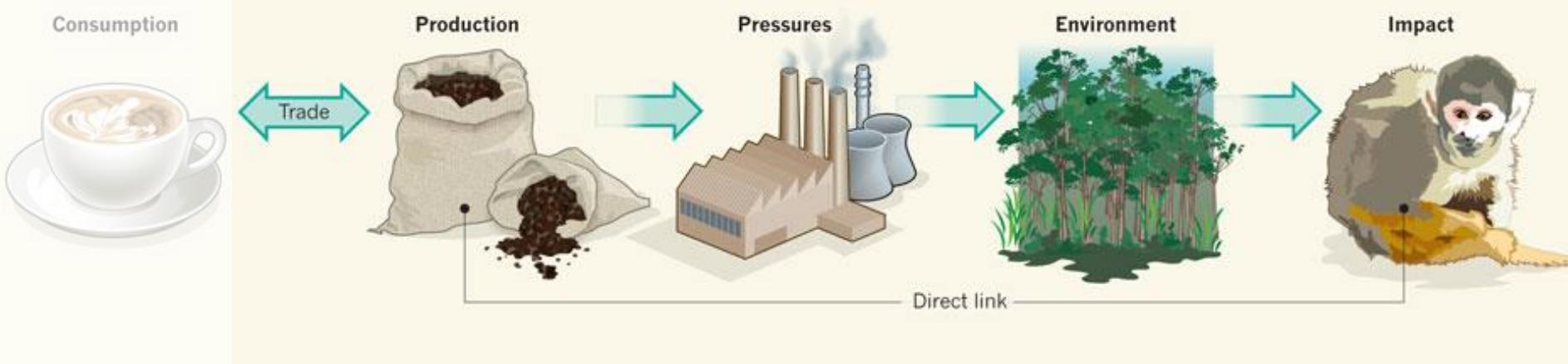
2nd Level

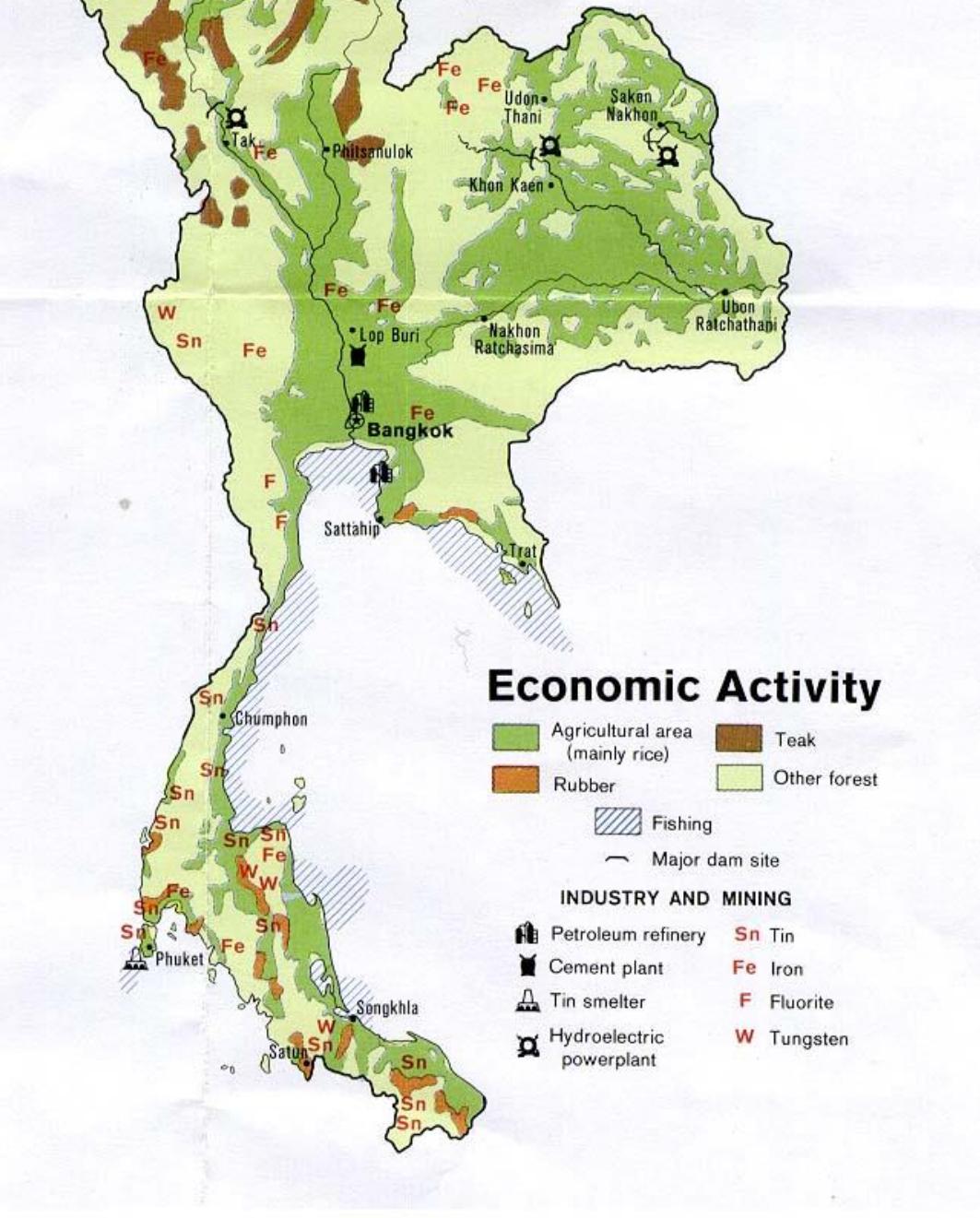
3rd Level

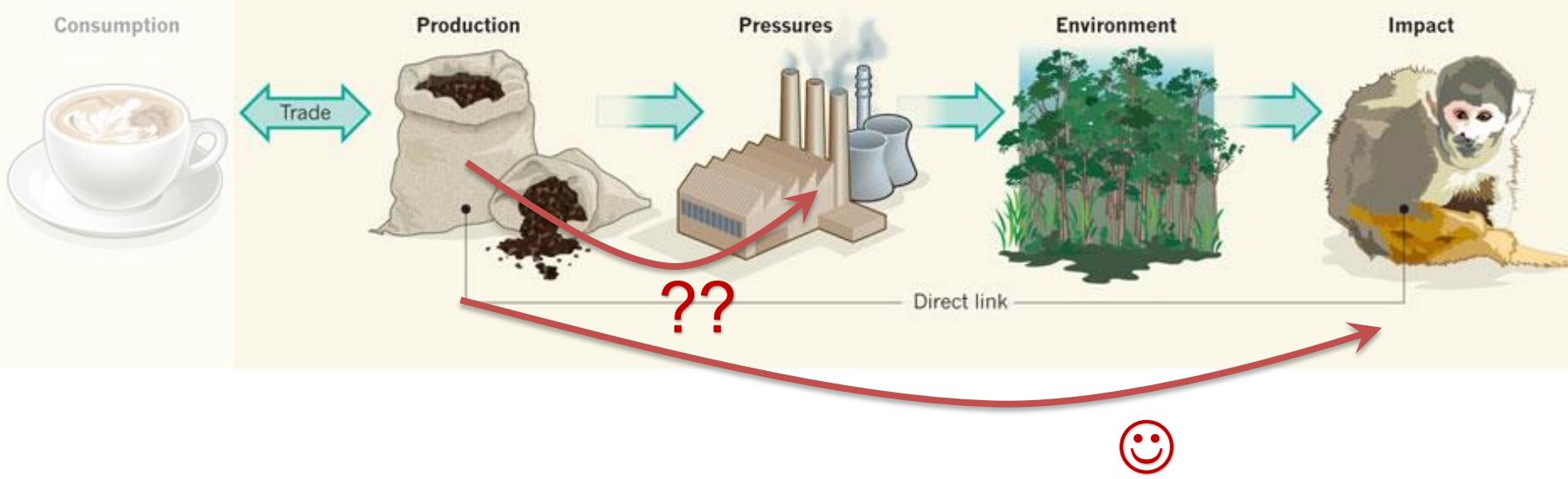
P.15e: Products of vegetable oils and fats

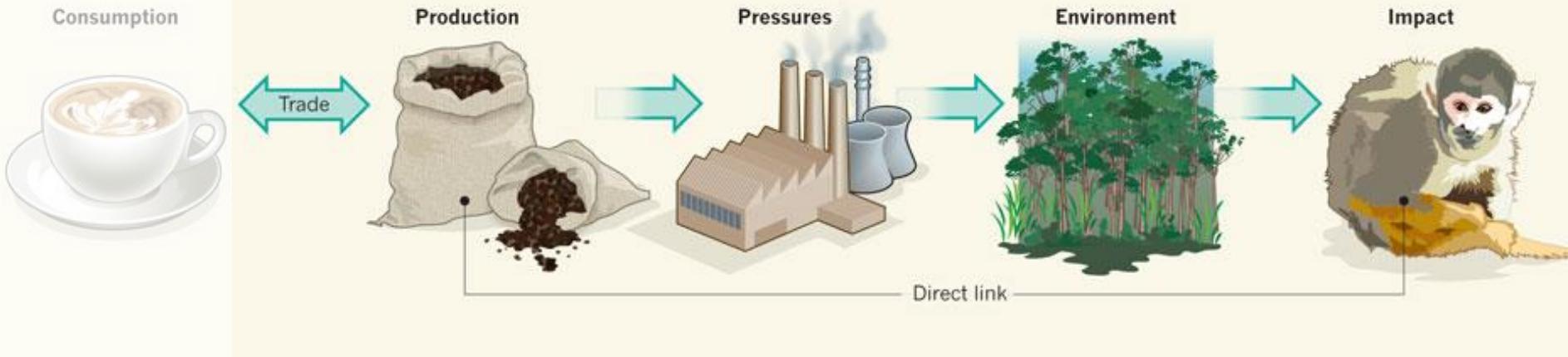
P.01e: Oil seeds



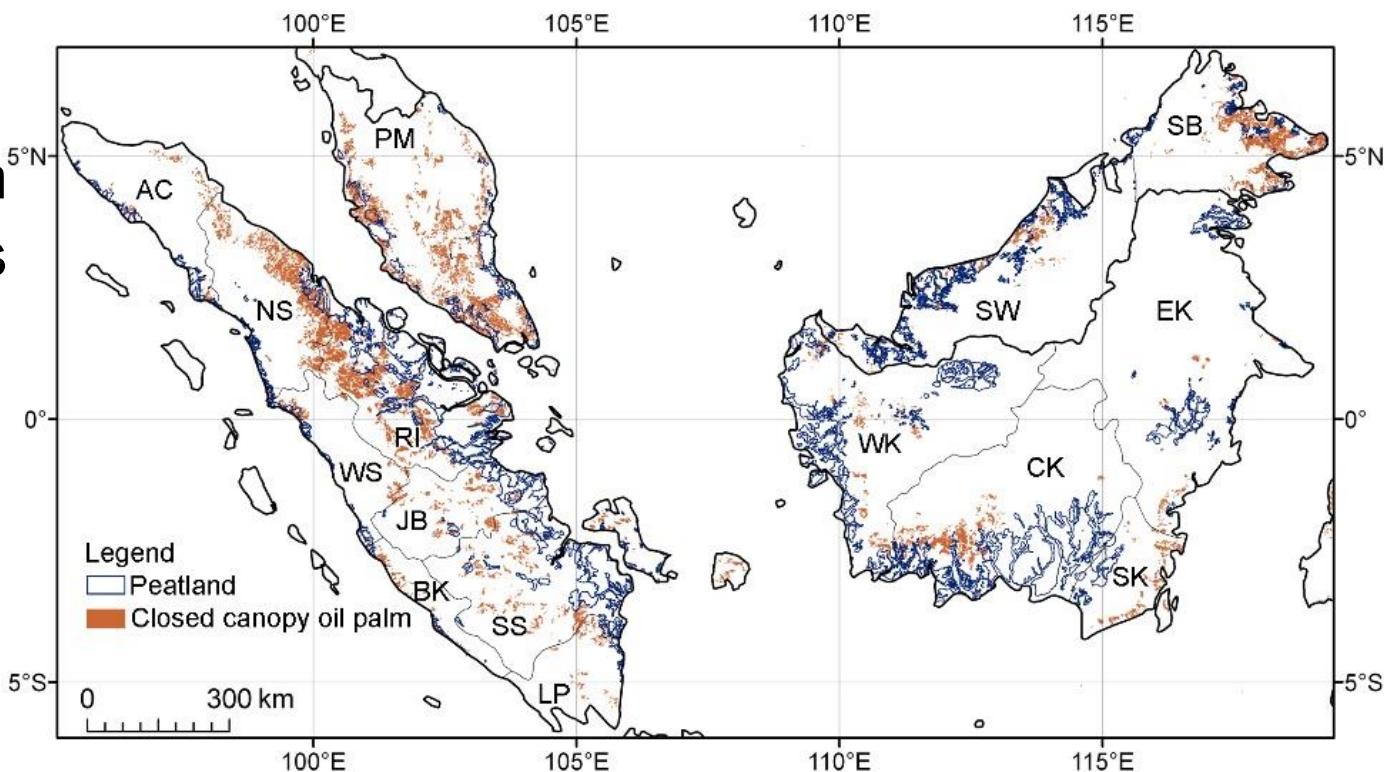


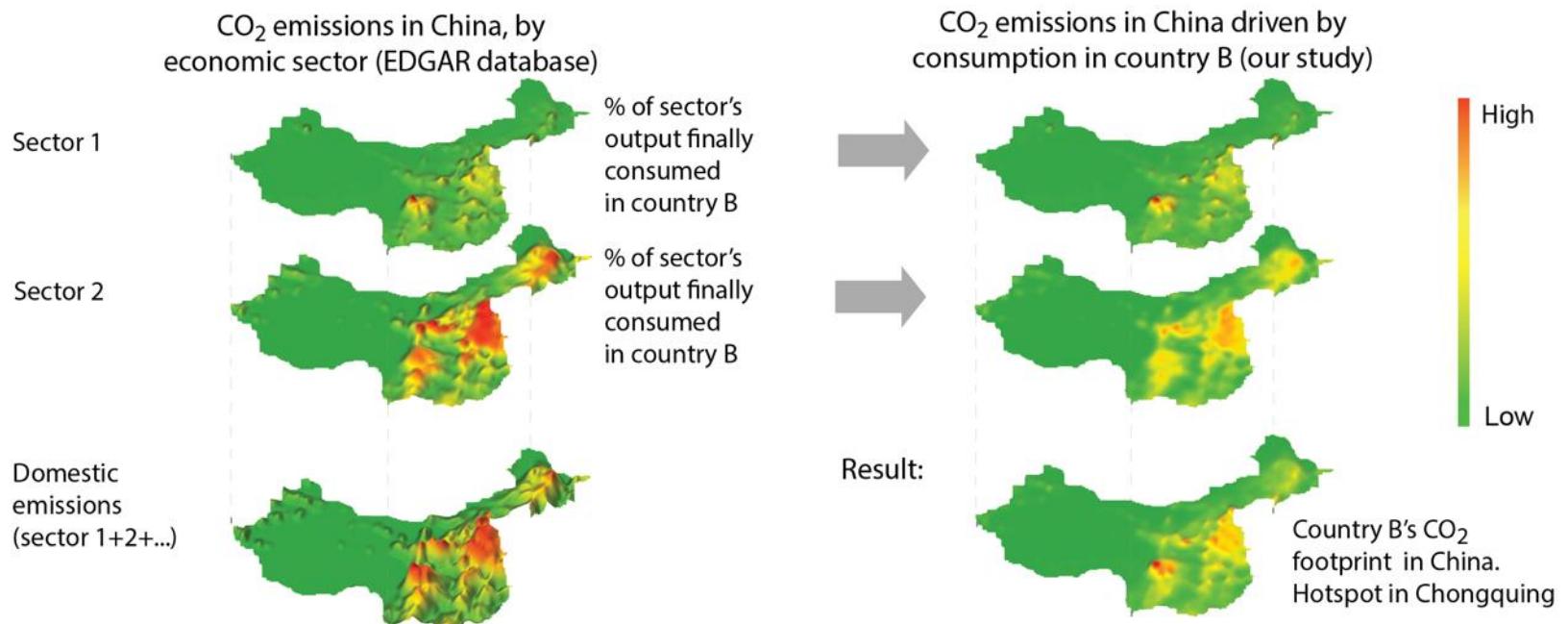
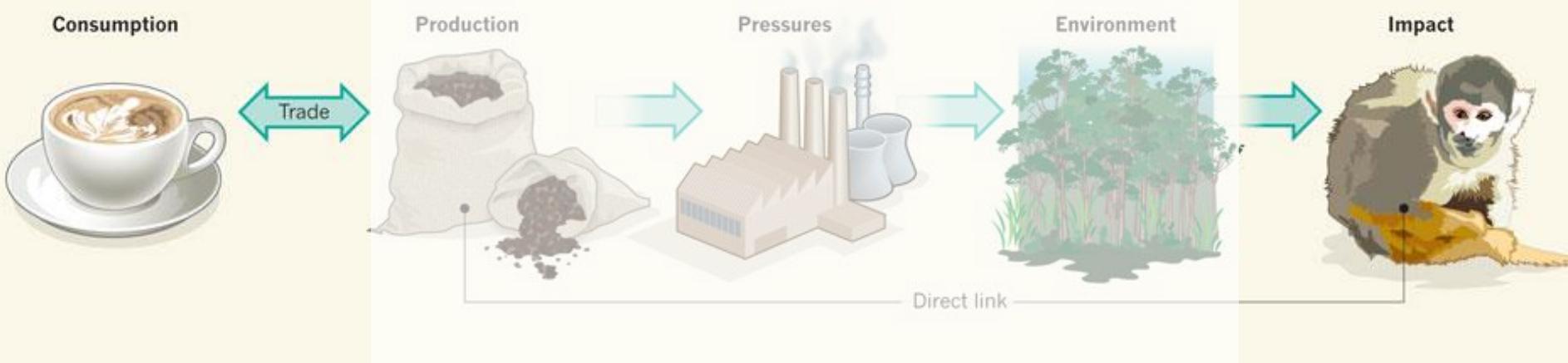






## Oil palm cultivation & species richness





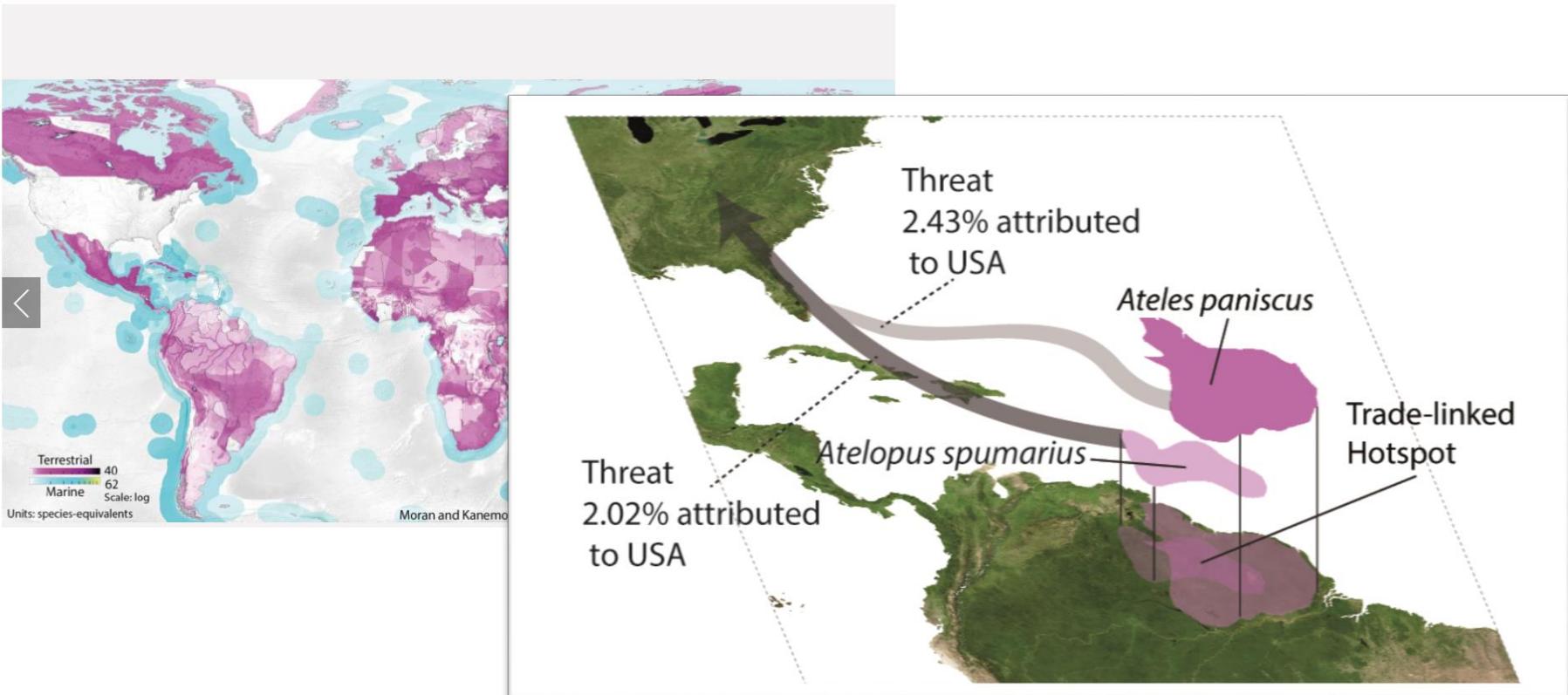


| ALL OVER THE MAP |

# Maps Reveal How Global Consumption Hurts Wildlife

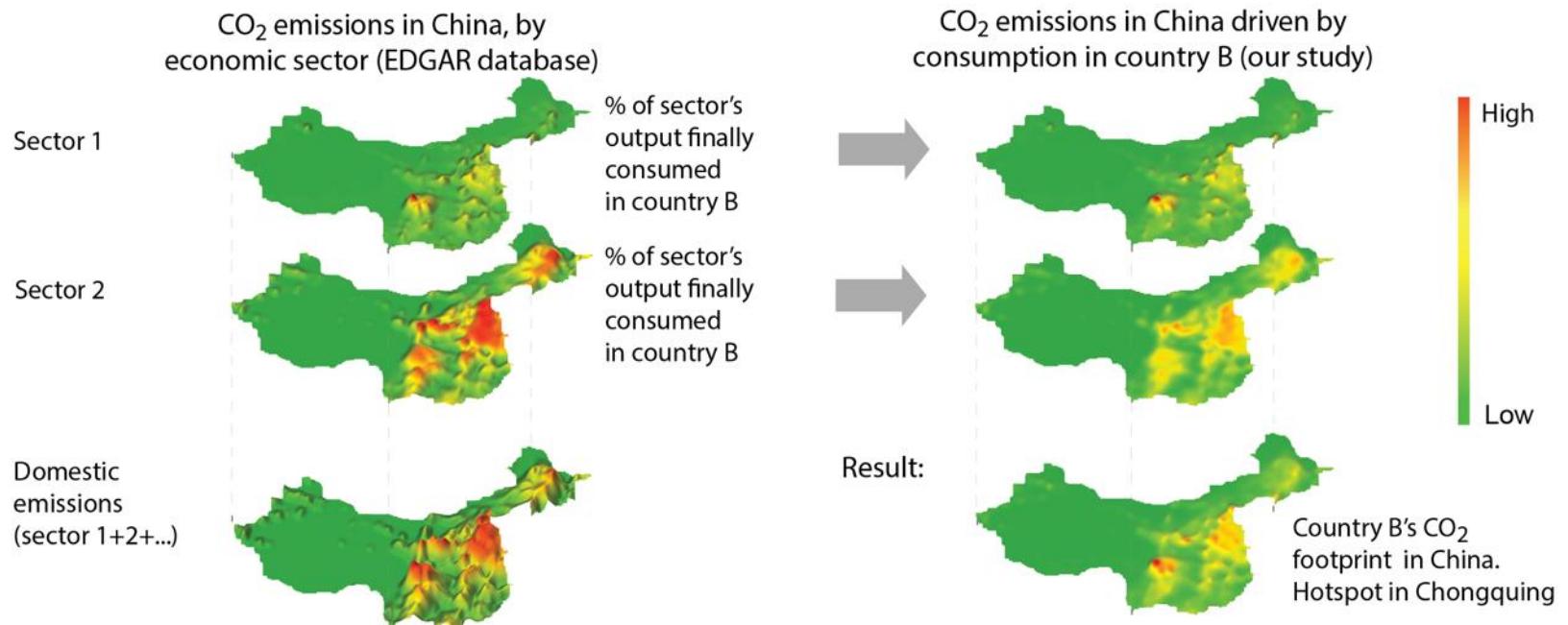
As international trade threatens vulnerable species and natural resources, new maps show some unexpected connections.

&lt; 1 / 4 &gt;





# Illustration of Method



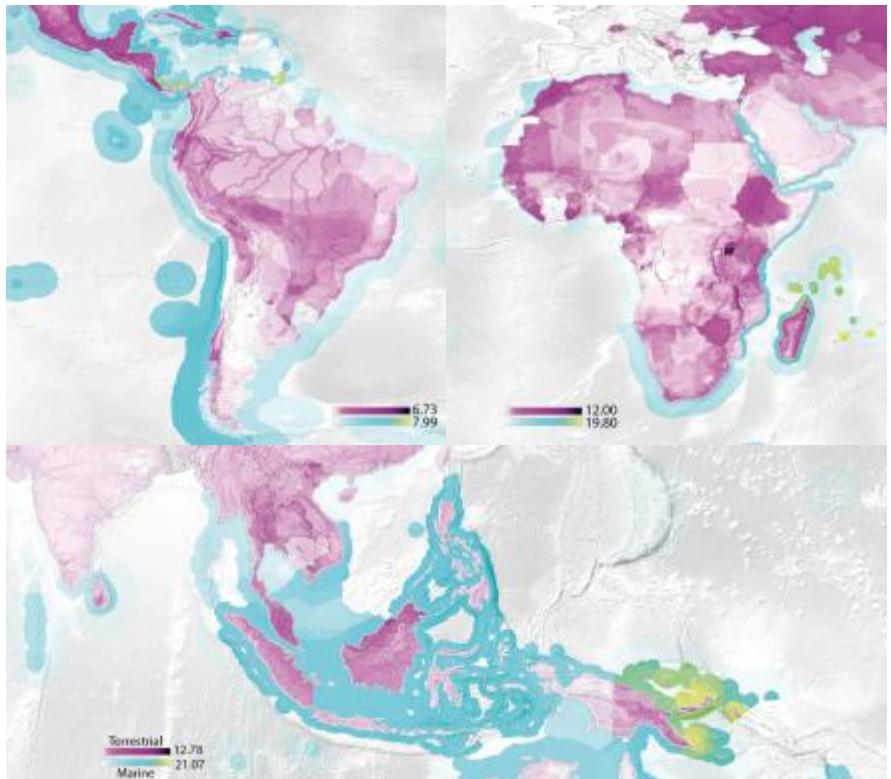


# Footprints 2.0 Project

## Objective:

- Connect environmental earth observation data with MRIO to estimate Spatially explicit Biodiversity Footprints
- <http://f20.indecol.no/>
- People: Daniel Moran, Francesca Verones, Richard Wood, Keiichiro Kanemoto, Johannes Többen

Figure 1: Species threat hotspots of Europe's final demand



D. Moran, K. Kanemoto. Identifying Species Threat Hotspots from Global Supply Chains Nature Ecology & Evolution, 1(1), 0023, 2017



# Thank you!

Daniel Moran, Keiichiro Kanemoto. "Identifying Species Threat Hotspots from Global Supply Chains" *Nature Ecology & Evolution*, 2017

Keiichiro Kanemoto, Daniel Moran, Edgar Hertwich. "Mapping the Carbon Footprint of Nations" *Environmental Science & Technology*, 50(19), pp.10512-10517, 2016.

Daniel Moran, Keiichiro Kanemoto. "Tracing Global Supply Chains to Air Pollution Hotspots" *Environmental Research Letters*, 11(9), 094017, 2016