United States Environmental Protection Agency

USEEIO v2.0

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Disclaimer

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USEEIO Models

A family of environmentally-extended input-output (EEIO) models of the US

- Depict environmental and economic performance of all commodities and industries in the US
- Track ~2000 unique releases or resource types
- Report 20 environmental, resource and socio-economic impact indicator scores
- Built on >9 million data points
- Include formal data quality characterization of results
- Open source data and modeling framework
- Most recent version (v2.0)
- Overview article in Journal of Cleaner Production (Yang et al., 2017)



v2.0 Basic Specs

- 2012 IO data, ~2012-2017 physical flows
- 411 commodities
- 2668 flows
- 23 indicators
- Total US Consumption, Production and Household Consumption vectors (2012)



v2 New Features

- more sectors than BEA
- domestic vs. foreign input and result distinction
- price adjustment matrices
- validation proofs



v2 Improved Data Description & More Data Distribution

- National Totals by Sector by NAICS-6 datasets in lieu of separate satellite tables
- harmonization with Federal LCA Commons Elementary Flow List
- additional data provision
 - Make and Use tables
 - industry and commodity output
 - USEEIO<->BEA<->NAICS crosswalk
 - domestic versions of matrices
 - more metadata



v2 Minor Changes from v1

- scrap included as a commodity (BEA, 2009)
- IO data year used as base model USD year (2012)
- U matrix renamed to $\ensuremath{\mathbb{N}}$



v2.0 availability

- 1. USEEIO v2.0.1-411 matrices and metadata in Excel
- 2. openLCA JSON format Federal LCA Commons
- 3. <u>Build model in R</u> with useeior::buildModel("USEEIOv2.0.1-411")

The software behind USEEIO

World -

2016 TRACI 2.1





Principle Tools for National Model

- 1. <u>useeior</u> Model specification, import of econ data, assembly, calculation
- 2. <u>flowsa</u> Environmental/employment data preparation
- 3. <u>LCIAformatter</u> Indicator data preparation



Comparing USEEIOv2 with USEEIOv1.2

- 1. Direct impact intensity coefficients (D coefficients)
- 2. Direct + iNdirect intensity coefficients (N coefficients)
- 3. Commodity ranking based on total impacts of consumption



Comparing D coefficients



Acidification Potential (kg SO2 eq/\$)



<u>Comparing D coefficients</u> (2)

Smog Formation Potential (kg O3 eq/\$) 0.0 0.2 0.3 0.1 0.4 Fresh soybeans, canola, flaxseeds, and other oilseeds Fresh wheat, corn, rice, and other grains Fresh vegetables, melons, and potatoes Fresh fruits and tree nuts Greenhouse crops, mushrooms, nurseries, and flowers arcane, peanuts, sugar beets, herbs and spices, and other crops Dairies Cattle ranches and feedlots Poultry farms Animal farms and aquaculture ponds (except cattle and poultry) Timber and raw forest products Wild-caught fish and game Agriculture and forestry support Unrefined oil and gas Ð Coal Copper, nickel, lead, and zinc Iron, gold, silver, and other metal ores œ lo_ € Dimensional stone Sand, gravel, clay, phosphate, other nonmetallic minerals Well drilling □ USEEIO1.2 Other support activities for mining Electricity O USEEIO2.0 Natural gas Drinking water and wastewater treatment Nonresidential building repair and maintanence Residential building repair and maintanence Manufacturing buildings Utilities buildings and infrastructure Schools and vocational buildings Highways, streets, and bridges Commercial structures, including farm structures Other nonresidential structures



<u>Comparing D coefficients</u> (3)





Comparing N coefficients





<u>Comparing N coefficients</u> (2)



CER US Consumption Impact Ranked by Commodity





Future Work



Near-term

- New technology introduction
- USEEIO State v1 Models
- Electricity disaggregation
- Model hybridization with process-data



Medium-term

- Import GHG coefficients for USEEIO
- WARM-USEEIO
- Waste Input-Output
- Final user component matrices



Long-term

- USEEIO-Global nested model
- Food Waste LCA



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Keep Informed

- Follow updates to the models table on our <u>technical content page</u> and look for upcoming training opportunities
- watch us on github as we develop new models in <u>useeior</u>
- Email us to request to be added to the USEEIO user email list

Contact Info

General USEEIO inquiries: ceser@epa.gov, add USEEIO in the subject line



Technical Details of USEEIOv2.0



Model Equations

Refer to the <u>USEEIO Technical Content page</u> OR see commodity-type model construction equations in Appendix 1 - Model Equations of the <u>Supply Chain GHG Factors report</u> (EPA, 2020)



Economic Data Inputs

Name	Creator	Sources	DataYears
Make and Use, Detail, Before Redefinitions, Producer Price	BEA	Bureau of Economic Analysis Industry Input- Output Accounts	2012
Gross Output by Industry	BEA	Gross Output By Industry	2002-2017
Gross Output Chain Price Index	BEA	<u>Gross Output By Industry</u>	2002-2017
Margins	BEA	Bureau of Economic Analysis Industry Underlying Estimates	2012
Import Matrix	BEA	Bureau of Economic Analysis Industry Input- Output Accounts	2012



Updated Environmental Data Inputs

Dataset

National Water Withdrawal Totals By Industry 2015 v1.1

National Criteria and Hazardous Air Pollutant Totals By Industry 2017 v1.1

National Point Source Releases to Ground By Industry 2017 v1.1

National Point Source Releases to Water By Industry 2017 v1.1

National Commercial Hazardous Waste Totals by Industry 2017 v1.1

National Land Occupation Totals By Industry 2012 v1.1

National Employment Totals By Industry 2017 v1.1



Mapped and Reused Environmental Data Inputs

Flows	Data Year	Ref
Mineral extraction	2014	v1.1 satellite tables
Energy extraction	2014	v1.1 satellite tables
Nitrogen and Phosphorus Releases from Agriculture	2010-2014	v1.1 satellite tables
Pesticide Releases from Agriculture	2010-2014	v1.1 satellite tables
Commercial non-hazardous waste	2014	<u>commercial waste by industry</u> <u>totals</u>
Construction non-hazardous waste	2014	<u>commercial waste by industry</u> <u>totals</u>
Commercial hazardous waste	2015	<u>commercial waste by industry</u> <u>totals</u>
Value Added	2012	Detail Use Before Redefinitions



Indicators - Impact Potential

Name	Code	Creator	Sources
Greenhouse Gases	GHG	USEPA	<u>TRACI 2.1</u>
Acidification Potential	ACID	USEPA	<u>TRACI 2.1</u>
Eutrophication Potential	EUTR	USEPA	<u>TRACI 2.1</u>
Freshwater Ecotoxicity Potential	ETOX	USEPA	<u>TRACI 2.1</u>
Human Health - Cancer	HCAN	USEPA	<u>TRACI 2.1</u>
Human Health - Noncancer	HNCN	USEPA	<u>TRACI 2.1</u>
Human Health Toxicity	HTOX	NA	Aggregation of HNCN and HCAN
Human Health - Respiratory Effects	HRSP	USEPA	<u>TRACI 2.1</u>
Ozone Depletion	OZON	USEPA	<u>TRACI 2.1</u>
Smog Formation Potential	SMOG	USEPA	TRACI 2.1



Indicators - Resource Use

Name	Code	Creator	Sources
Freshwater withdrawals	WATR	USEPA	<u>LCIAformatter FEDEFL</u> Inventory Methods
Land use	LAND	USEPA	<u>LCIAformatter FEDEFL</u> Inventory Methods
Hazardous Air Pollutants	HAPS	USEPA	<u>LCIAformatter FEDEFL</u> Inventory Methods
Pesticides	PEST	USEPA	<u>LCIAformatter FEDEFL</u> Inventory Methods
Nonrenewable Energy Use	NNRG	USEPA	<u>LCIAformatter FEDEFL</u> Inventory Methods
Renewable Energy Use	RNRG	USEPA	<u>LCIAformatter FEDEFL</u> Inventory Methods
Energy Use	ENRG	USEPA	LCIAformatter FEDEFL Inventory Methods
Minerals and Metals Use	MNRL	USEPA	LCIAformatter FEDEFL Inventory Methods



Indicators - Economic, Jobs and Waste Generation

Name	Code	Creator	Sources
Value Added	VADD	USEPA	USEEIOv1.1 - Elementary Flows and Life Cycle Impact Assessment (LCIA) Characterization Factors
Jobs Supported	JOBS	USEPA	USEEIOv1.1 - Elementary Flows and Life Cycle Impact Assessment (LCIA) Characterization Factors
Commercial RCRA Hazardous Waste	CRHW	USEPA	Analyzing economy-scale solid waste generation using the United States environmentally- extended input-output model
Commercial Municipal Solid Waste	CMSW	USEPA	Analyzing economy-scale solid waste generation using the United States environmentally- extended input-output model
Commercial Construction and Demolition Debris	CCDD	USEPA	Analyzing economy-scale solid waste generation using the United States environmentally- extended input-output model



Final Demand Vectors

Representations of final demand included in model

Vector	Formula
Production	$h_d + g_d + v_d + x + \delta$
Consumption	h + g + v
Household Consumption	h

h = household consumption g = government consumption i = investment $_d$ = domestic only δ = change in inventories



Waste Sectors - Before

Before disaggregation

7 new Sectors: Solid waste, Hazardous waste, Material separation, Remediation, Landfilling, Incinerators, Other waste collection





Waste Sectors - After

After disaggregation

7 new Sectors: Solid waste, Hazardous waste, Material separation, Remediation, Landfilling, Incinerators, Other waste collection





Validation

Flow validation

1. Source totals = national flow totals by industry

2. flow-industry mapping validation

Model validation

1. model commodity output calculation = commodity output vector

2. model total flow calculation = national flow totals by sector

USEEIO v2.0.1-411 build and validation record



Sector coverage of flows





Validating model output calc

$$q = L\hat{y}$$

q = commodity output

- L = Leontief inverse of model A
- y = final demand vector for US production
- ^ = diagonalized



Validating model flow calc

$$E_{c} = B_{\chi,c}L\hat{y}$$
$$E_{c} = (C_{m}E_{i}')'$$
$$C_{m} = V'\hat{x}^{-1}$$
$$B_{\chi,c} = B_{i} \circ \chi V q^{-1}$$

 E_c = model input flows by industry transformed into flow by commodity

 $B_{\gamma,c}$ = satellite matrix in commodity form, modified for χ adjustment

- B_i = satellite matrix in industry form
- χ = industry output ratios of environmental data year: model year
- L = Leontief inverse of model A
- y = final demand vector for US production

 C_m = commodity mix matrix

V = Make table; *q* = commodity output; *x* = industry output

[•] for Haddard product,' for transpose



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