



Wir schaffen Wissen – heute für morgen

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Brightway2

A new contribution to open source industrial ecology

Brightway²



Free and open source



LCA



CALL ME MAYBE
C.R. JEPSEN

In development since 2012

>12.000 sloc

>100 pages of documentation

Extensions for:

- Dynamic LCA
- Regionalization
- Parameterization
- Meta-processes



Not for everyone!

2

Brightway2 is open source software for IO and LCA industrial ecology calculations. It is a **framework** for calculations, and works especially well when integrated with other models or databases.

There is a lot on Brightway2 online: <http://brightwaylca.org/>, <http://brightway2.readthedocs.org/en/latest/>, so this presentation will not be extensively annotated.

Design goals: Freedom

- No fixed database schema

```
{  
    'code': 'T17 SSAFRICA',  
    'database': 'gmm-model',  
    'linker': 'Background databases',  
    'location': 'SSAFRICA',  
    'name': 'Hydrogen Fuel Cell Transport',  
    'output_name': 'T1',  
    'row': 48,  
    'sheet': 'demands',  
    'spreadsheet name': 'Transport, fuel cell hybrid, electrolysis',  
    'technology': 'T17',  
    'unit': 'meter'  
}
```

3

One primary design goal is not to force a certain database schema; rather, the database schema should be a function of the question to be answered and the original data.

In the screenshot, the black fields are normal LCA data fields, and blue are added specifically for this example.

Design goals: Freedom

- **No fixed** database schema
- **Projects** are self-contained workspaces

```
In [1]: from brightway2 import *

In [2]: projects.current
Out[2]: 'default'

In [3]: list(databases)
Out[3]: ['biosphere3']

In [4]: projects.current = 'GMM'

In [5]: list(databases)
Out[5]:
['CARMA 2025',
 'ecoinvent 3.1 cutoff without energy',
 'ecoinvent 2.2',
 'ecoinvent 2.0',
 'ENTSO',
 'ecoinvent 3.1 cutoff',
 'biosphere3',
```

4

Each **project** is a subdirectory with its own copy of all data, so you can keep a copy of each project or paper, and modify copies without worrying about corrupting your primary data.

Design goals: Freedom

- **No fixed** database schema
- **Projects** are self-contained workspaces
- Easy **data manipulation**

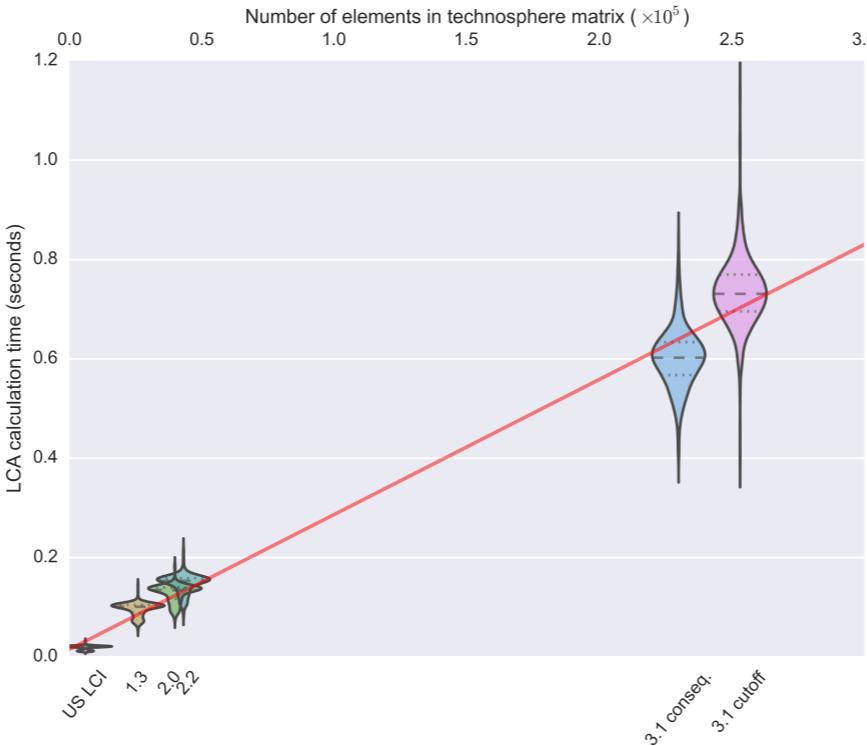
```
In [1]: from brightway2 import *

In [2]: for activity in Database("ecoinvent 3.1 cutoff"):
....:     for exchange in activity.technosphere():
....:         if exchange.input['unit'] == 'kilowatt hour':
....:             exchange['amount'] = 0
....:             exchange.save()
....:
```

5

Data transforms can be written in Python, and make it easy to do data manipulation.

Design goal: Power



6

A final design goal is performance. Good performance of static and stochastic calculation is a prerequisite for exploring new ideas, as well as uncertainty and sensitivity analysis.

Design goal: Power

Compute LCA scores for all of ecoinvent 3.1 cutoff in < 5 minutes

- One LCIA method
- Single threaded
- 2014 Desktop

> 100 Monte Carlo iterations a second

- Multithreaded
- 2011 Laptop
- Ecoinvent 2.2

Program structure

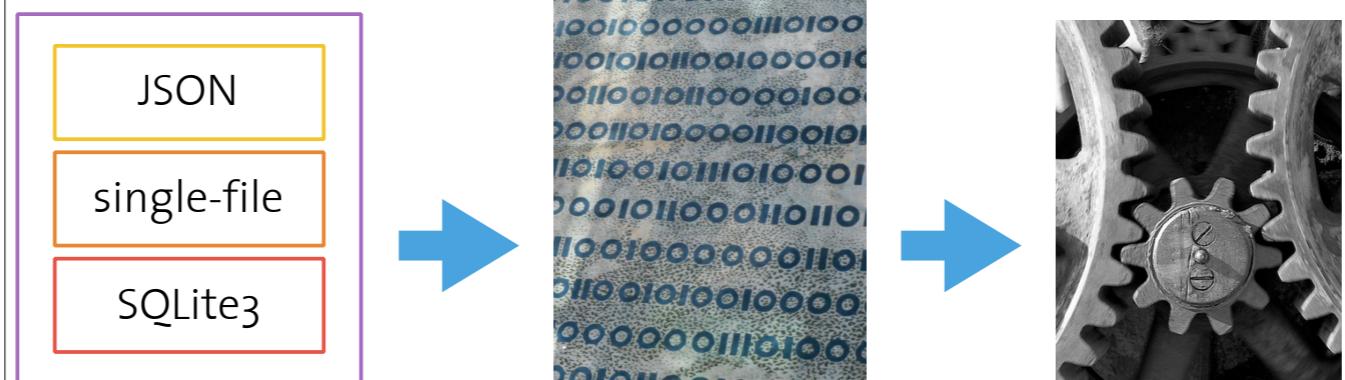


Photo credits:

<https://www.flickr.com/photos/mikecogh/8192314996>
<https://www.flickr.com/photos/brentinot/4221291984>

8

Data is stored in two ways: As the raw data, with all text fields, and as a structured array with only numerical values which is faster to load and prepare for calculations.

Design goal: Integration



Python is the *de facto* language
of scientific programming

A
B

Develop and integrate your
own Python model

pandas

$$y_{it} = \beta' x_{it} + \mu_i + \epsilon_{it}$$

The scikit-learn logo, featuring a blue circle and an orange square with the word "learn" in white.



NumPy



SciPy.org

Incredible library of
python packages

julia



JavaScript

MATLAB

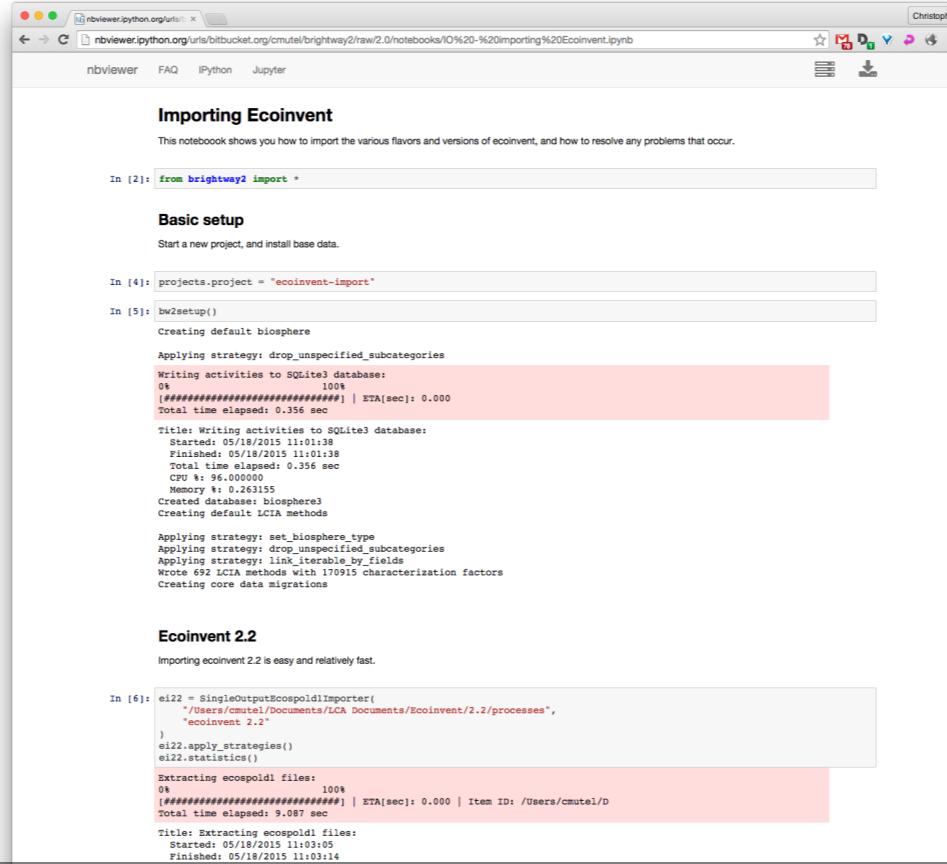


Integrate with other
languages

9

AB is the [activity browser](#).

User interfaces



The screenshot shows a Jupyter notebook interface with the title "Importing Ecoinvent". The notebook contains the following code and its execution output:

```
In [2]: from brightway2 import *
In [4]: projects.project = "ecoinvent-import"
In [5]: bw2setup()
Creating default biosphere
Applying strategy: drop_unspecified_subcategories
Writing activities to SQLite3 database:
0|########################################################################| ETA[sec]: 0.000
Total time elapsed: 0.356 sec
Title: Writing activities to SQLite3 database:
Started: 05/18/2015 11:01:38
Finished: 05/18/2015 11:01:38
Total time elapsed: 0.356 sec
CPU #: 96.000000
Memory #: 0.263155
Created database biosphere3
Creating default LCIA methods
Applying strategy: set_biosphere_type
Applying strategy: drop_unspecified_subcategories
Applying strategy: link_iterable_by_fields
Wrote 692 LCIA methods with 170915 characterization factors
Creating core data migrations
```

Ecoinvent 2.2

```
In [6]: e122 = SingleOutputEcoinventImporter(
    "/Users/cmutel/Documents/LCIA Documents/Ecoinvent/2.2/processes",
    "ecoinvent 2.2")
e122.apply_strategies()
e122.statistics()
Extracting ecoinvent 2.2 files:
0|########################################################################| ETA[sec]: 0.000 | Item ID: /Users/cmutel/D
Total time elapsed: 9.087 sec
Title: Extracting ecoinvent 2.2 files:
Started: 05/18/2015 11:03:05
Finished: 05/18/2015 11:03:14
```

10

One fantastic interface for scientific work are the interactive notebooks provided by the [Jupyter project](#), which combine working code with notes, graphics, interactive Javascript, and other awesomeness.

Version 2.0

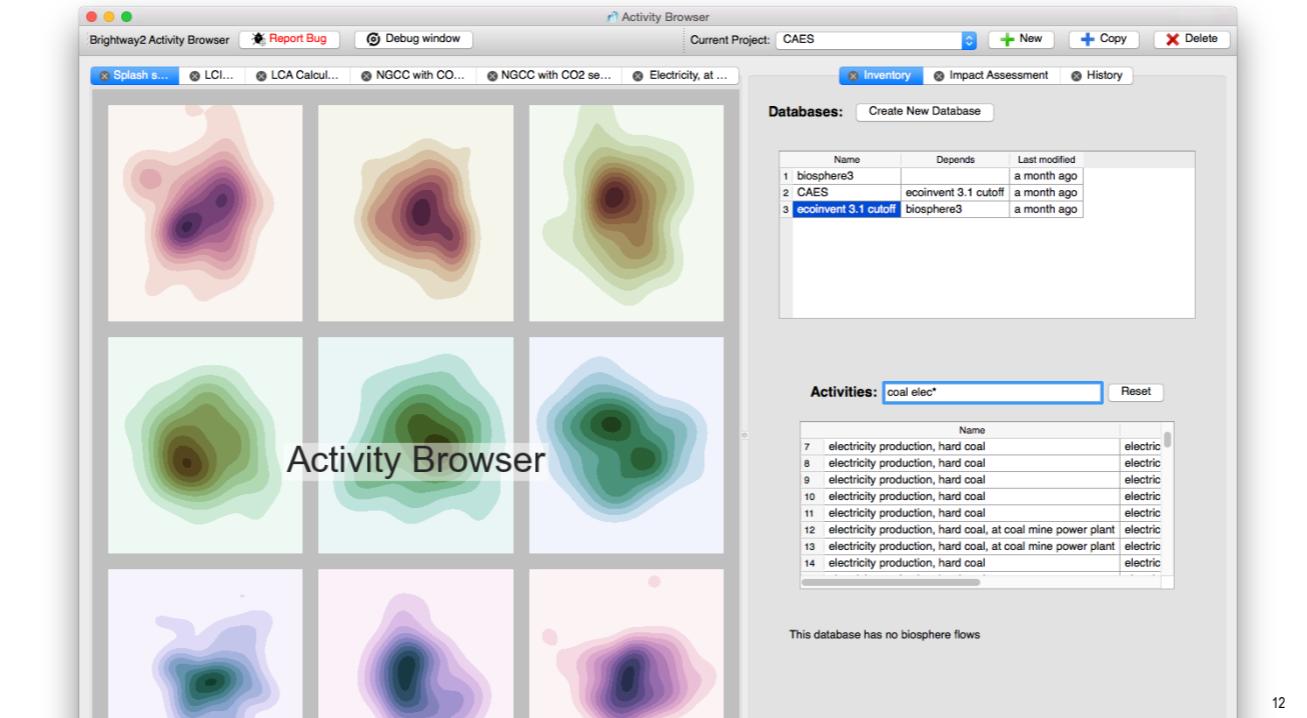
- Full text search

```
In [1]: from brightway2 import *

In [2]: Database("biosphere3").search("carbon dioxide foss*")
Out[2]:
['Carbon dioxide, fossil' (kilogram, None, ('air', 'non-urban air or from high stacks')),
 'Carbon dioxide, fossil' (kilogram, None, ('air', 'urban air close to ground')),
 'Carbon dioxide, fossil' (kilogram, None, ('air', 'lower stratosphere + upper troposphere')),
 'Carbon dioxide, fossil' (kilogram, None, ('air', 'low population density, long-term')),
 'Carbon dioxide, fossil' (kilogram, None, ('air',)),
 'Carbon dioxide, non-fossil' (kilogram, None, ('air', 'low population density, long-term')),
 'Carbon dioxide, non-fossil' (kilogram, None, ('air', 'non-urban air or from high stacks')),
 'Carbon dioxide, non-fossil' (kilogram, None, ('air', 'urban air close to ground')),
 'Carbon dioxide, non-fossil' (kilogram, None, ('air', 'lower stratosphere + upper troposphere'))
 'Carbon dioxide, non-fossil' (kilogram, None, ('air',))]
```

Version 2.0

- Full text search
- Graphical interface



Version 2.0

- Full **text search**
- **Graphical** interface
- Traverse supply chain in **both directions**

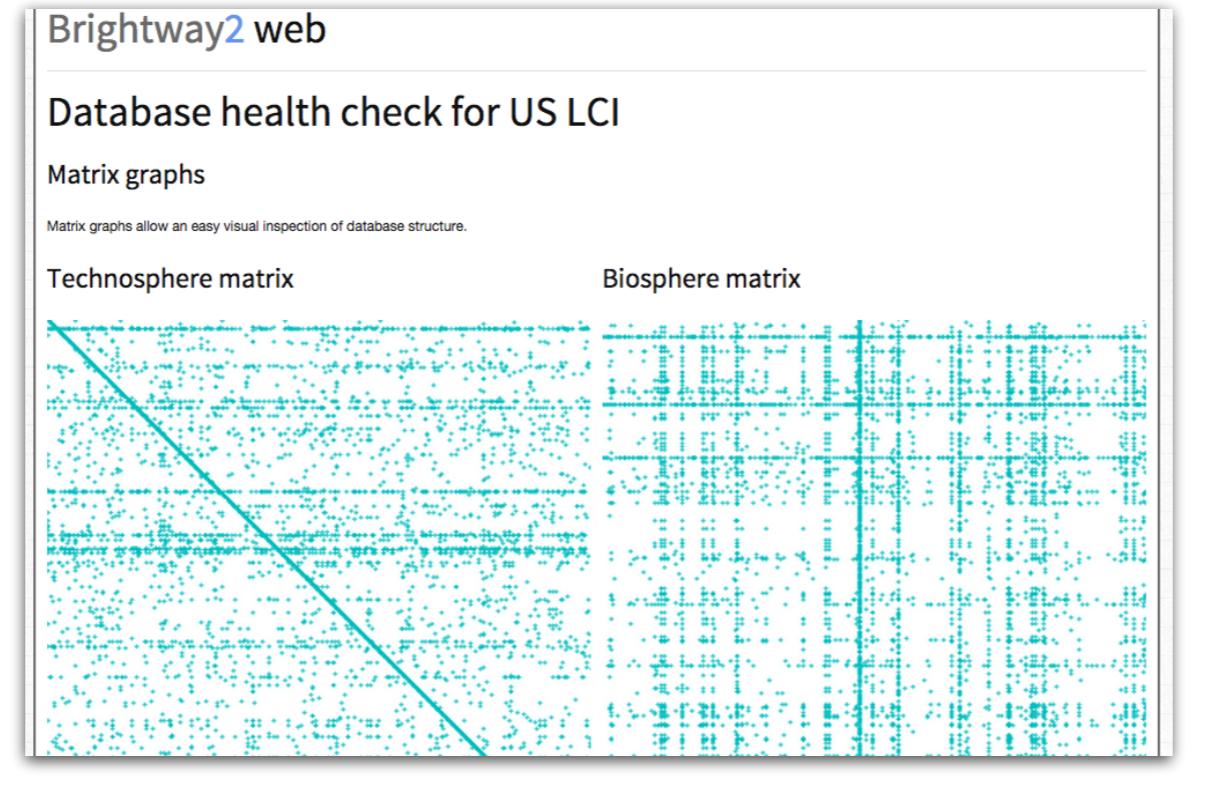
```
In [4]: for exc in activity.upstream():
...:     print(exc)
...:
Exchange: 0.097577 kilogram 'market for indium' (kilogram, GLO, None) to 'indium tin oxide powder production, nano scale, for sputtering target' (kilogram, RoW, None)>
Exchange: 0.0054898 kilogram 'market for indium' (kilogram, GLO, None) to 'photovoltaic laminate production, CIS' (square meter, RoW, None)>
Exchange: 0.022688 kilogram 'market for indium' (kilogram, GLO, None) to 'sputtering target production, sintered, indium tin oxide' (kilogram, RER, None)>
Exchange: 0.0054898 kilogram 'market for indium' (kilogram, GLO, None) to 'photovoltaic laminate production, CIS' (square meter, DE, None)>
Exchange: 0.022688 kilogram 'market for indium' (kilogram, GLO, None) to 'sputtering target production, sintered, indium tin oxide' (kilogram, RoW, None)>
Exchange: 0.00089368 kilogram 'market for indium' (kilogram, GLO, None) to 'photovoltaic laminate production, a-Si' (square meter, RoW, None)>
Exchange: 0.097577 kilogram 'market for indium' (kilogram, GLO, None) to 'indium tin oxide powder production, nano scale, for sputtering target' (kilogram, RER, None)>
Exchange: 0.00089368 kilogram 'market for indium' (kilogram, GLO, None) to 'photovoltaic laminate production, a-Si' (square meter, US, None)>
```

13

One key change in version 2.0 is the use of a database table for exchanges, which allow us to traverse the supply chain in both directions, as well as easily update exchange links.

Version 2.0

- Database **health check**



14

The database health check is an online report that looks at a number of different data quality indicators for a database.

Version 2.0

- Database **health check**

Multiooutput processes

Multiooutput processes can be used in Brightway2 (see [Multiooutput processes in LCA](#)), but should be handled with care. Each multiooutput process should be inspected carefully to make sure the intended effects will occur.

There are no multiooutput processes in this database

Page rank

This are the 20 most important processes, when the technosphere matrix is analyzed using the Page Rank algorithm. Page Rank scores are normalized to the number of processes in the database, i.e. each score is actually $\text{page rank score} / \text{number of processes in database}$. Anything higher 50 is pretty high - these processes should be audited for completeness and accuracy, as they will be very important in calculating impact assessment scores.

Name	Score	Unit	Categories	Location
Diesel, at refinery	98.98	L	Petroleum and Coal Products Mnf.,Petroleum Refineries	RNA
Residual fuel oil, at refinery	35.92	L	Petroleum and Coal Products Mnf.,Petroleum Refineries	RNA
Transport, combination truck, diesel powered	33.64	ton kilometer	Truck Transportation,General Freight Trucking	US
Electricity, at Grid, US, 2008	32.85	kilowatt hour	Utilities,Utilities	RNA
Transport, train, diesel powered	31.91	ton kilometer	Rail Transportation,Rail Transportation	US
Transport, combination truck, average fuel mix	30.97	ton kilometer	Truck Transportation,General Freight Trucking	US
Natural gas, combusted in industrial boiler	21.81	cubic meter	Utilities,Steam and Air-Conditioning Supply	US
Transport, barge, diesel powered	21.63	ton kilometer	Water Transportation,Inland Water Freight Transportation	US
Transport, barge, average fuel mix	21.43	ton kilometer	Water Transportation,Inland Water Freight Transportation	US
Transport, barge, residual fuel oil powered	21.27	ton kilometer	Water Transportation,Inland Water Freight Transportation	US
Transport, pipeline, unspecified petroleum products	20.05	ton kilometer	Utilities,Fossil Fuel Electric Power Generation	RNA
Liquefied petroleum gas, combusted in industrial boiler	17.37	L	Utilities,Steam and Air-Conditioning Supply	US

Version 2.0

- Database **health check**

Information content			Uncertainty errors		
Exchange type	# Exchanges	# Unique exchanges	Uncertainty type	# Exchanges	# Errors
Technosphere	5155	4893	Undefined or unknown uncertainty	19883	0
Biosphere	13982	13079	Uniform uncertainty	3	0

More information:

- Email: cmutel@gmail.com
- Website: brightwaylca.org
- Development blog: chris.mutel.org



PSI, 26. Juni 2015

17